

# ***Nanotoxicology as a Predictive Science that can be explored by high content screening and the use of computer- assisted hazard ranking***

*André Nel M.B.,Ch.B; Ph.D*

*Professor of Medicine and Chief of the Division of NanoMedicine at UCLA*

*Director of the NSF- and EPA-funded Center for the Environmental Implications  
of Nanotechnology (UC CEIN)*

*Director of the NIEHS-funded Center for NanoBiology and Predictive Toxicology*

Copyright 2010 – The Regents of the University of California. All Rights Reserved.

Contact [cein@cnsi.ucla.edu](mailto:cein@cnsi.ucla.edu) to obtain permission to use copyrighted material.

This materials is based on work supported by the National Science Foundation and Environmental Protection Agency under Cooperative Agreement # NSF-EF0830117. Any opinions, findings, and conclusions or recommendations expressed in this material are those of the author(s) and do not necessarily reflect the views of the National Science Foundation or the Environmental Protection Agency.

# Proposal

## Predictive Toxicological Paradigm to resolve the safety assessment of a large number of nanomaterials

### In Vivo Adverse Outcomes

Maximum of  $10^2$  animals  
per experiment (weeks to months)

Validity of  
predictions

Material  
physicochemical  
properties

QSARs

- mechanism of injury
- toxicological pathway

QSARs

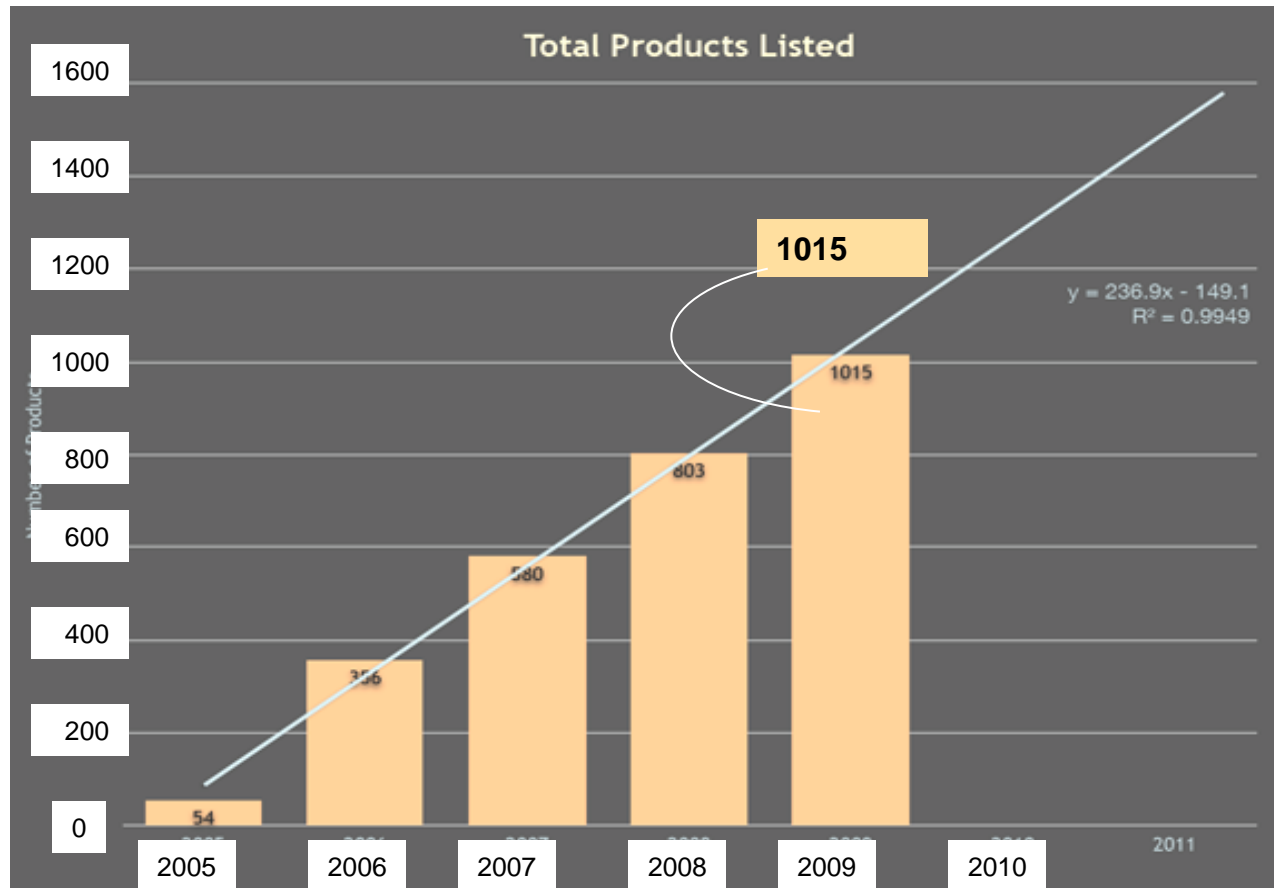
### Cellular or Bio-molecular Injury Endpoints

Up to  $10^5$  measurements per day

# Talk Outline

1. Why do we need a predictive science for hazard ranking and decision making?
2. What exactly are the linkages that connect the *in vitro* knowledge domain to *in vivo* hazard assessment?
3. What is the appropriate place for high content or high throughput screening and nano informatics in a predictive hazard platform?
4. What other benefits are there in using a predictive toxicology approach?

# Prolific Growth of Nanotechnology



# Why do we need a Predictive Science for ENM hazard assessment?

1. Need for a hazard platform that keeps pace with the rate at which new ENMs are being introduced
2. It is impossible to use animal testing as the primary platform for ENM hazard assessment
3. Need for an *in vitro* property-activity approach that utilizes high-volume data collection to prioritize and speed up *in vivo* decision-making
4. Need for a robust scientific platform to link *in vitro* to toxicological relevant *in vivo* outcomes (will propose mechanistic toxicological pathways)

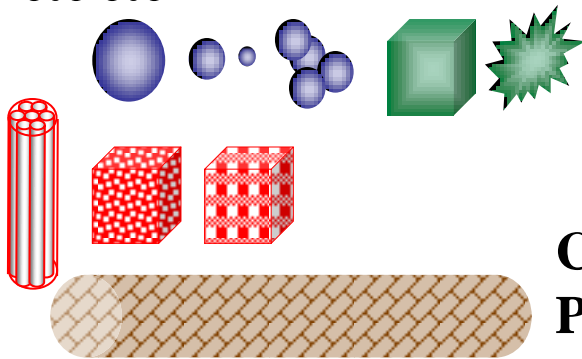
# A large number of material properties and bio-interfaces generate an endless number of possibilities at the nano-bio interface

**Different sizes/shapes/aspect ratios**

**States of agglomeration**

**Media interactions**

etc etc



**Cell membrane**

**Proteins in the medium, cells et**

**DNA and nucleus**

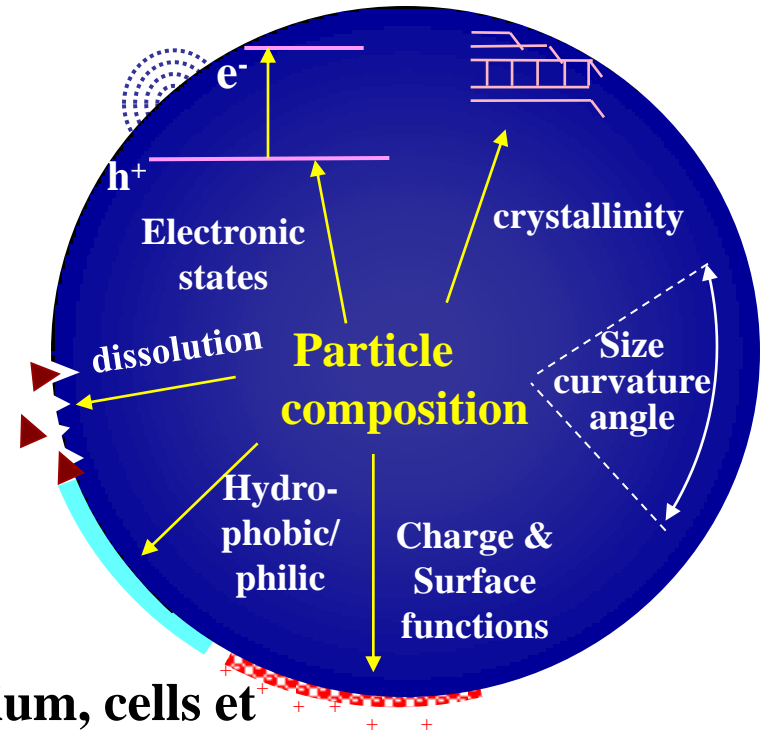
**Cell uptake (endocytosis/phagocytosis etc)**

**Subcellular localization/organelar interactions**

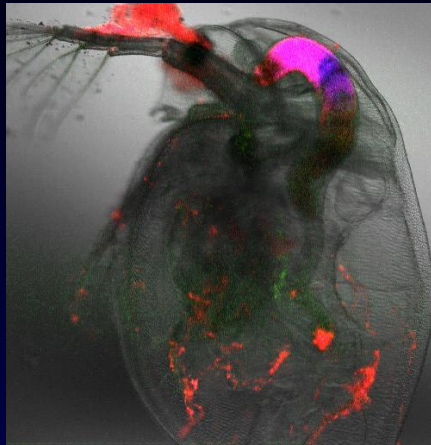
**Mitochondrial functions/ATP production**

**Bio-accumulation/biopersistence**

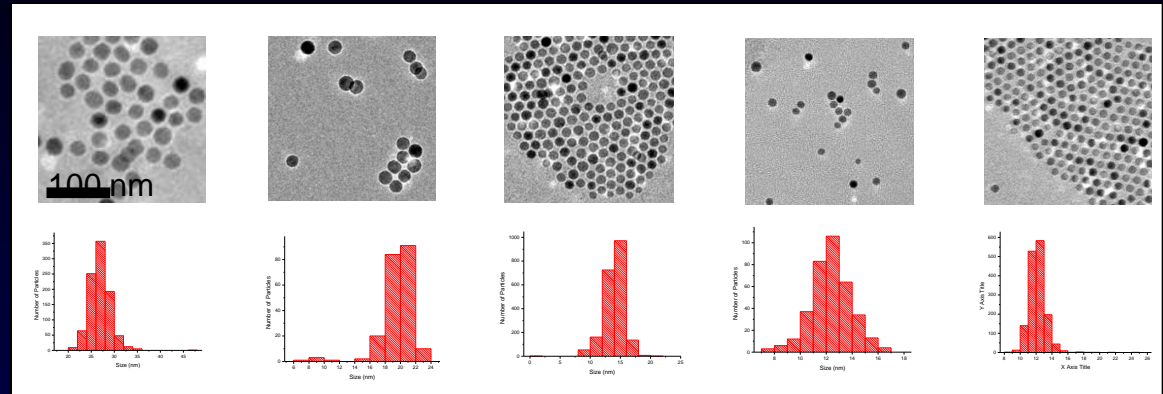
etc etc



# It's All So Complex but ..



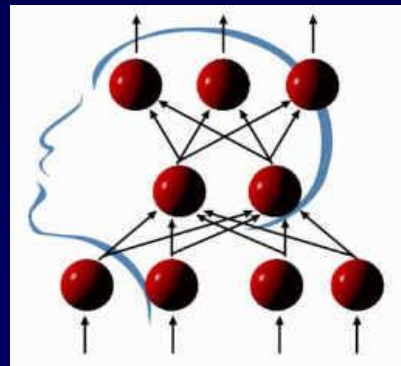
We can track NP and use their properties



We can make model libraries of materials



We can use high throughput approaches



We can use computational power to enhance and speed up decision-making

We can use property-activity relationships to make safer materials or prevent exposure to materials with hazardous properties

# US National Academy of Science's Recommended Transformative approach *“Toxicity Testing in the 21st Century: A Vision and a Strategy” (2007)*

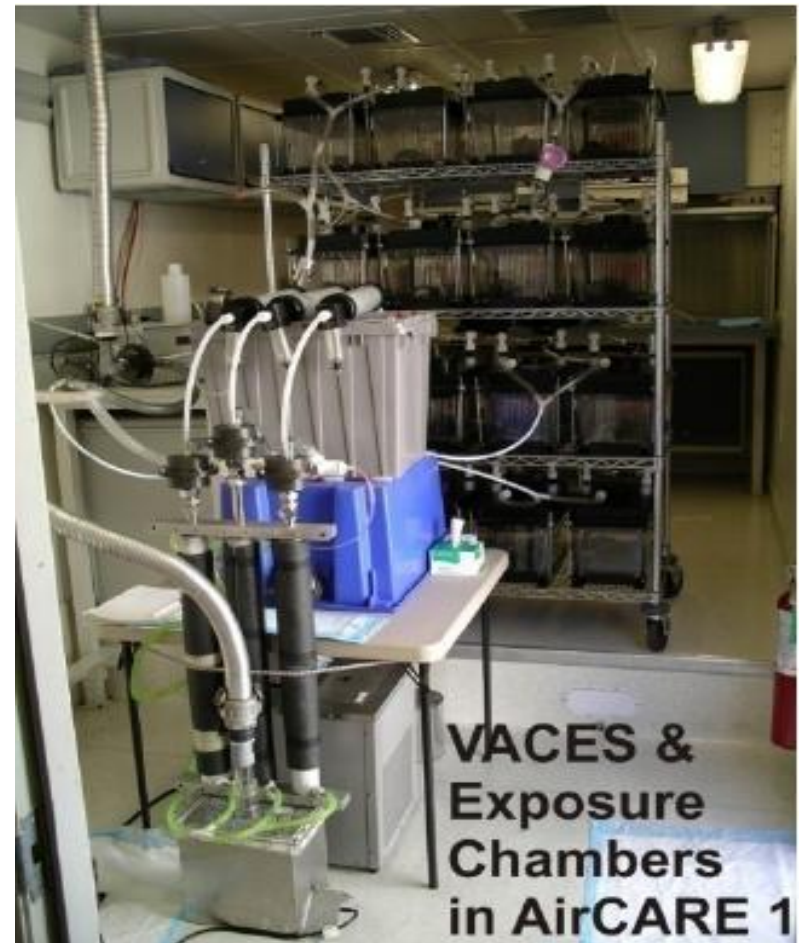
- Provide wide coverage of potential toxicants
- Use a robust scientific base for testing (instead of a descriptive approach in whole animals)
- Comprehensive array of predictive *in vitro* tests that utilize toxicity pathways and mechanisms
- High content or high throughput screening to facilitate testing of large batches of materials
- *In vitro* hazard to be confirmed *in vivo*



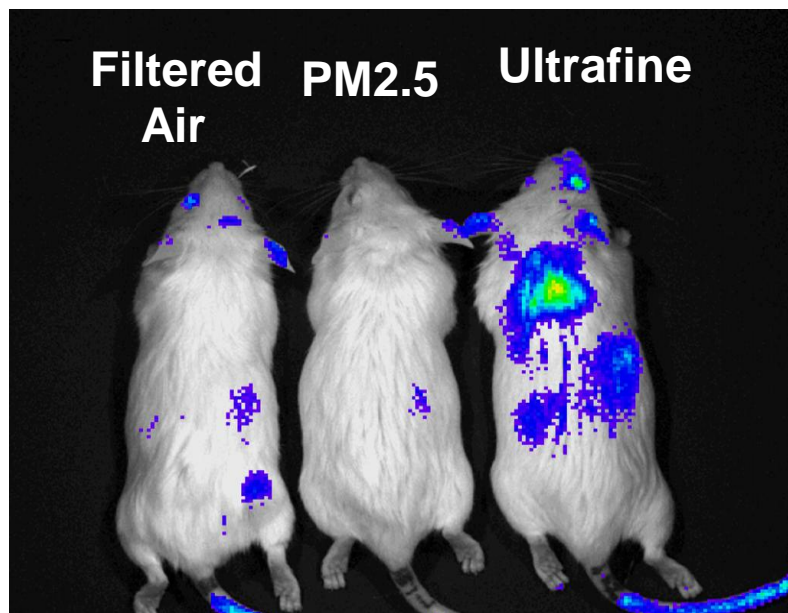
# NP toxicological considerations covered in this talk

1. Predictive pulmonary toxicity
2. Predictive environmental toxicology , e.g., zebrafish

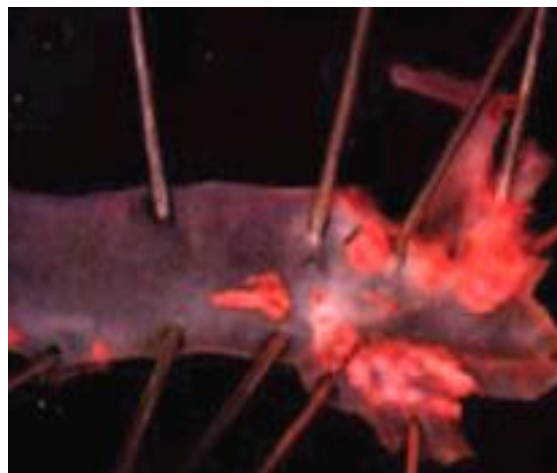
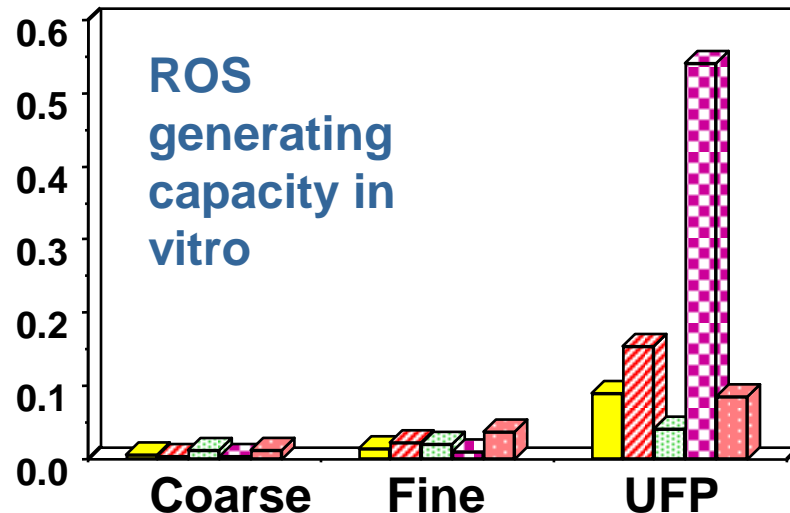
# Predictive toxicology in air pollution research



# Oxidative Stress as a Predictive Toxicological Paradigm: Real-life Proof that in vitro assessment of oxidant potential is linked to the exaggerated cardiovascular effects of ultrafine particles

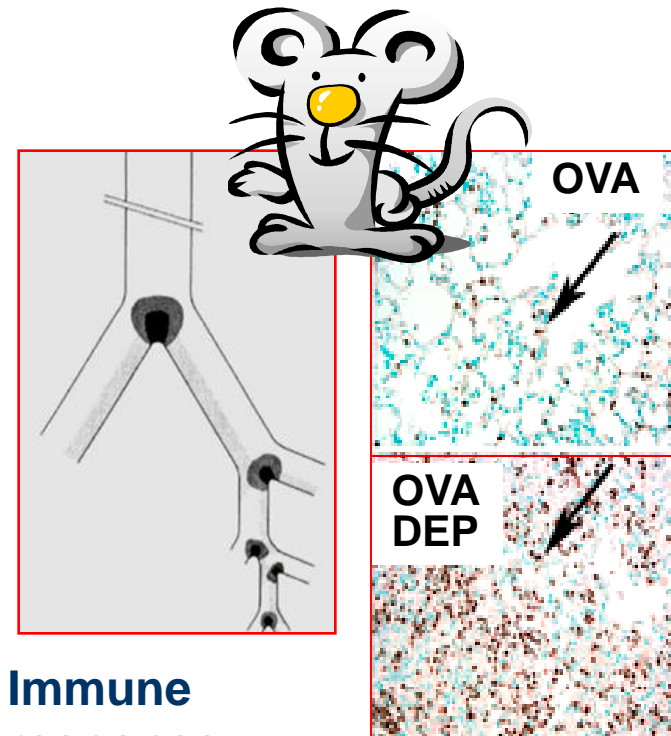
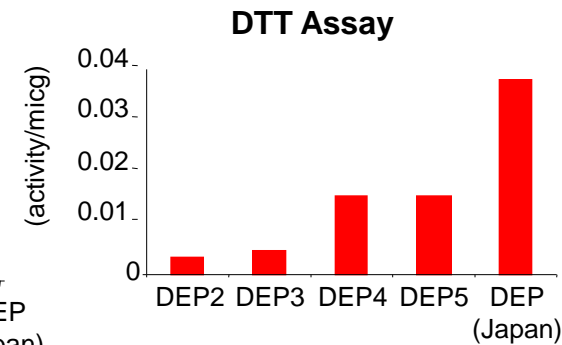
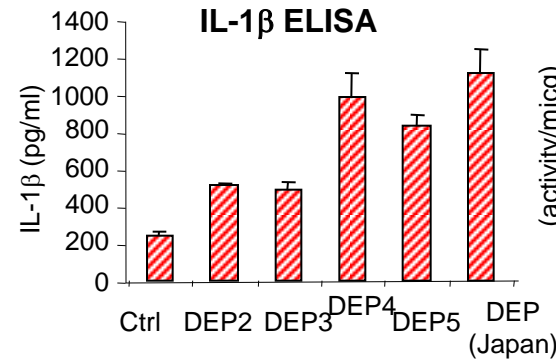
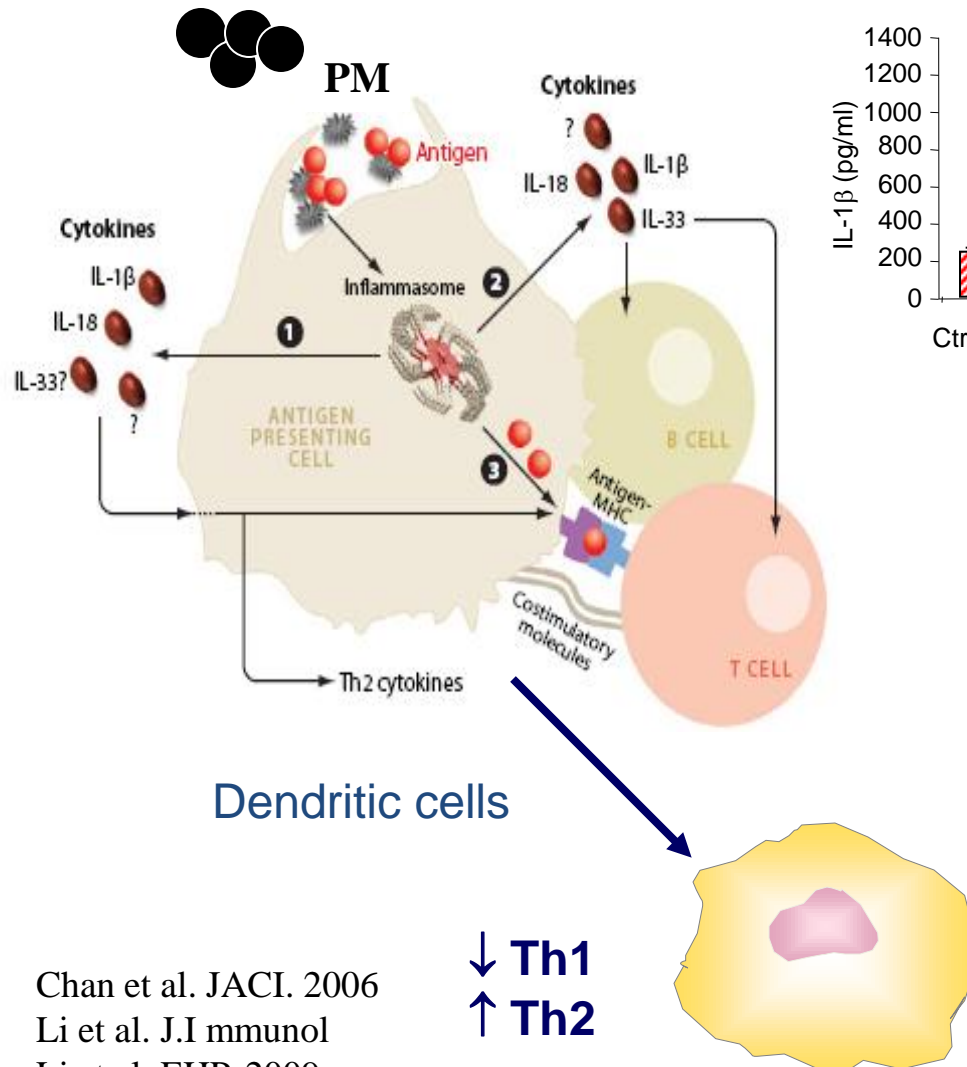


Generate Oxidant Injury in the Lung and Cardiovascular system (the lung signal is from an oxidative stress gene that is turned in a live animal exposed on an LA freeway)



Increased rate of atherosclerosis in UFP compared to PM2.5 exposures

# Oxidative Stress as a Predictive Toxicological Paradigm: Use of the mouse asthma model to demonstrate that ultrafine oxidant potential is linked to allergic sensitization

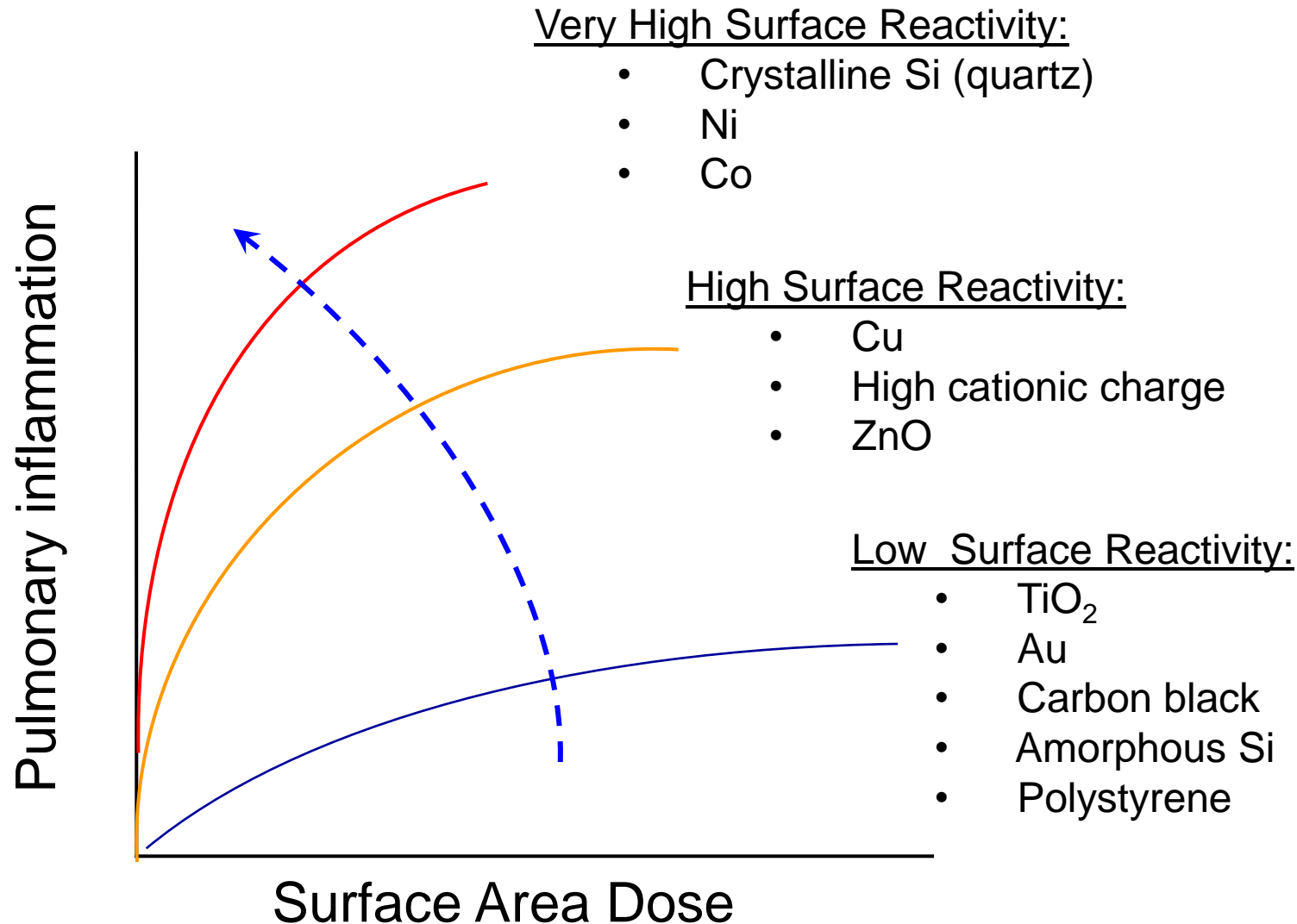


Chan et al. JACI. 2006  
Li et al. J. Immunol  
Li et al. EHP. 2009

↓ Th1  
↑ Th2

Immune  
response

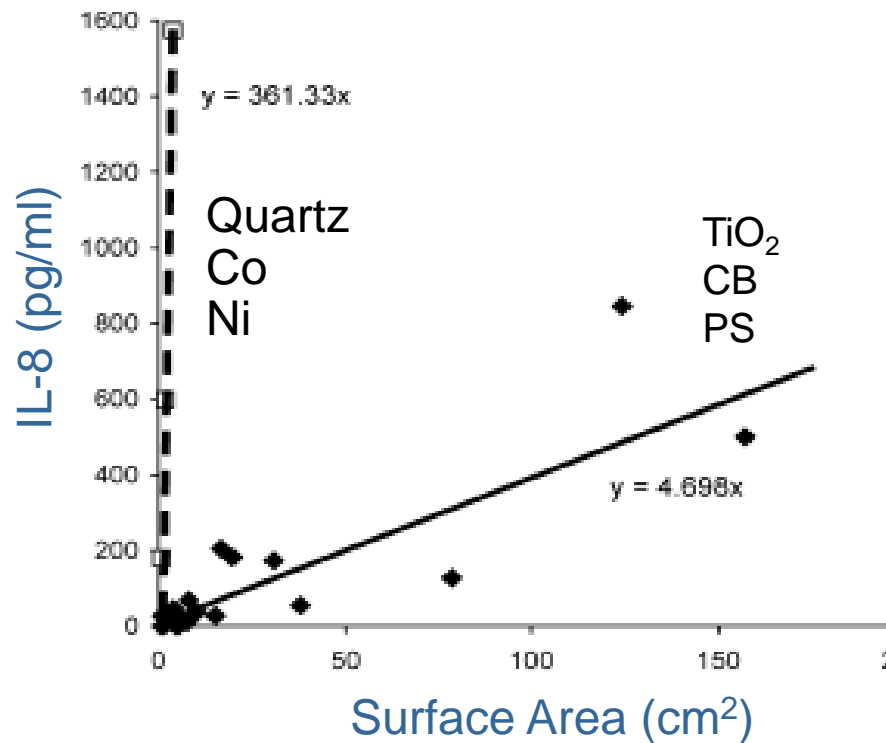
# A proposed paradigm for ENM pulmonary toxicity evaluation: Concept of NP Surface Reactivity



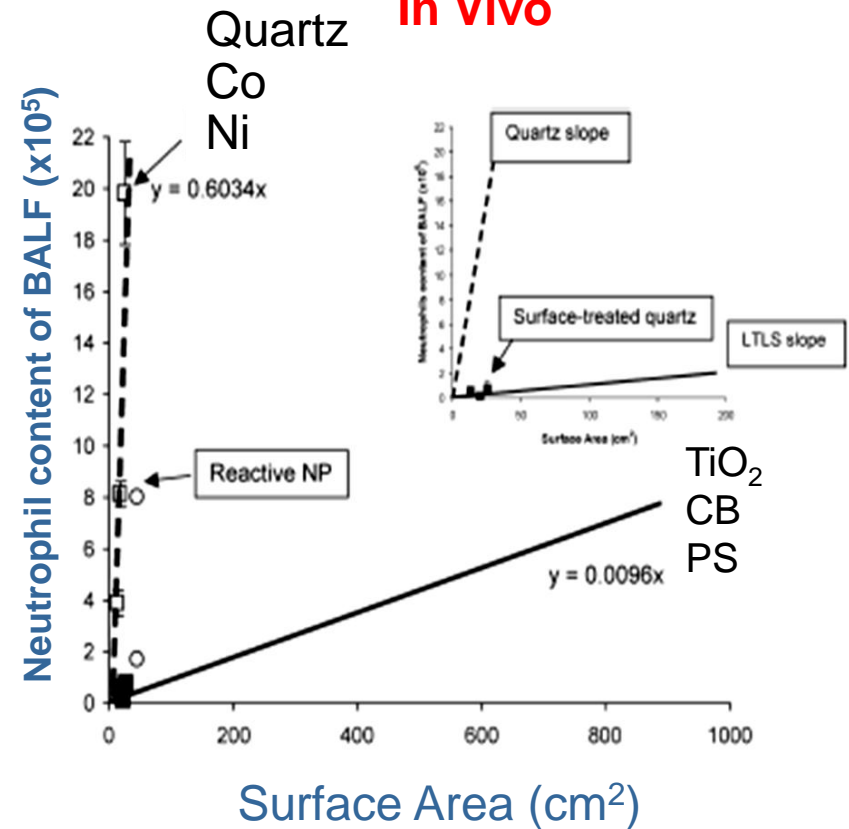


Example: When Using IL-8 production in a bronchial epithelial cell line to discern between the inflammation potential of High versus Low Reactive Surface Area NP in rats

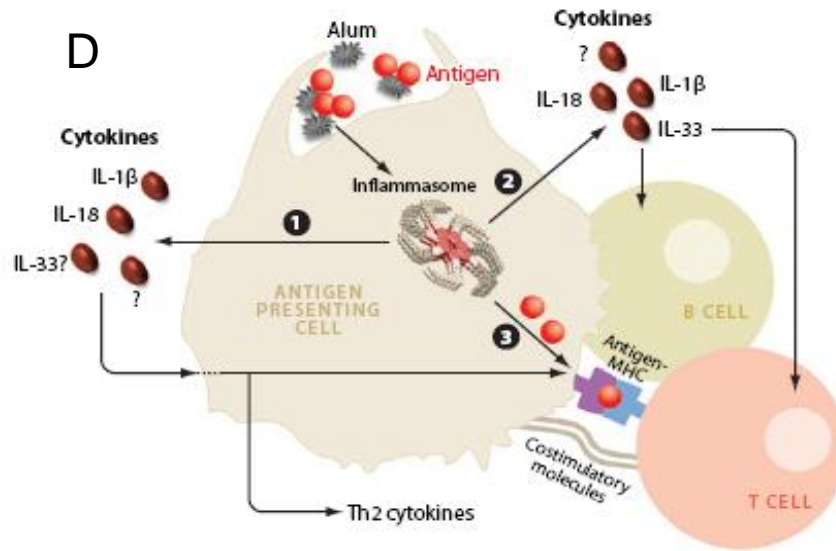
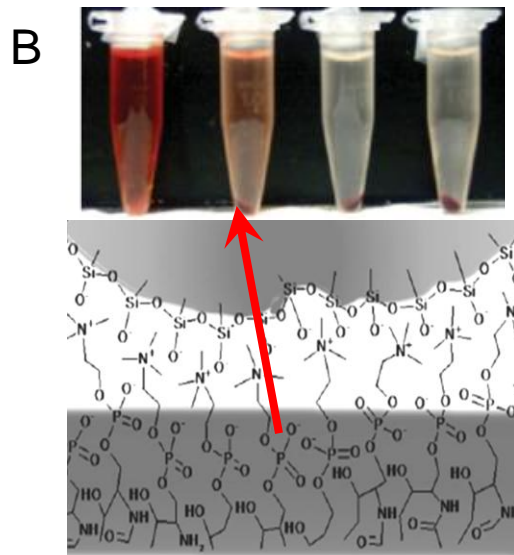
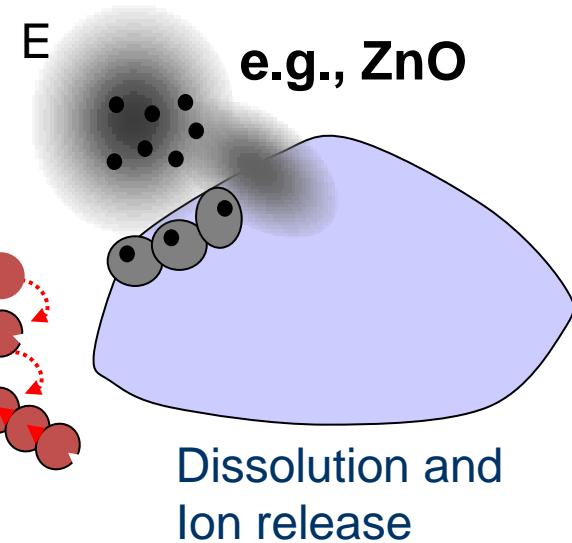
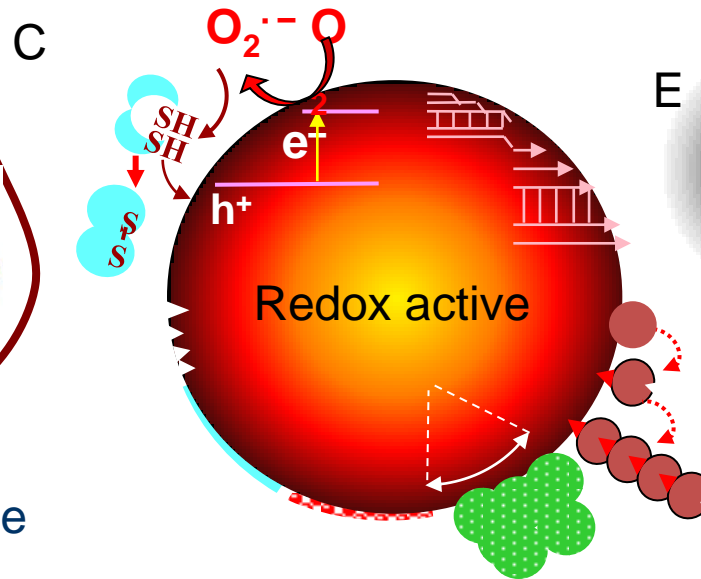
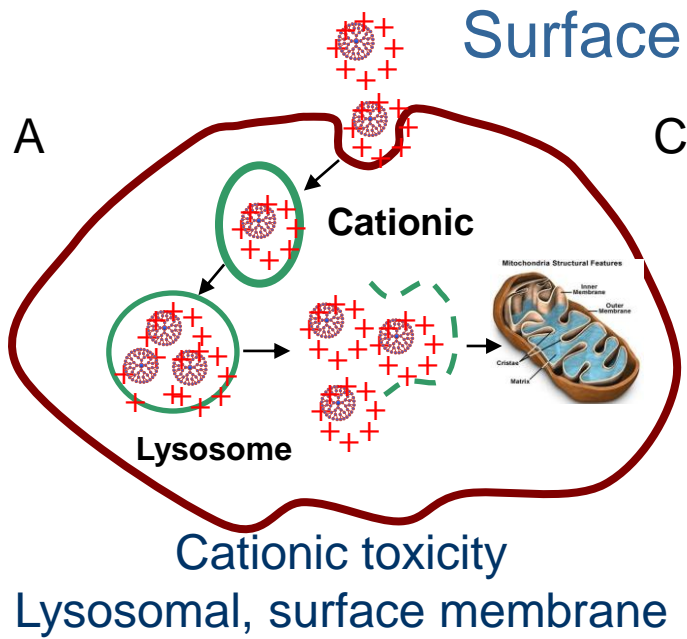
**In Vitro**



**In Vivo**



# Surface Reactivity Paradigms



Immune danger signals,  
inflammasomes  
e.g., dendritic cells

Nel et al. Science.  
2006  
Nel et al. Nature  
Materials. 2009

# Metal Fume Fever: Metal oxide toxicity

Welders exposed to ZnO, other metal oxides: Cu, Mg, Sn, or Cd

3-10 hrs post-exposure: flu-like illness, fever, malaise, chills, dry cough, shortness of breath

BAL cytokines:  $\text{TNF}\alpha$ , IL-6, IL-8, MIP



Pathophysiology: marked increases in lung PMLs 20–24 hr after exposure

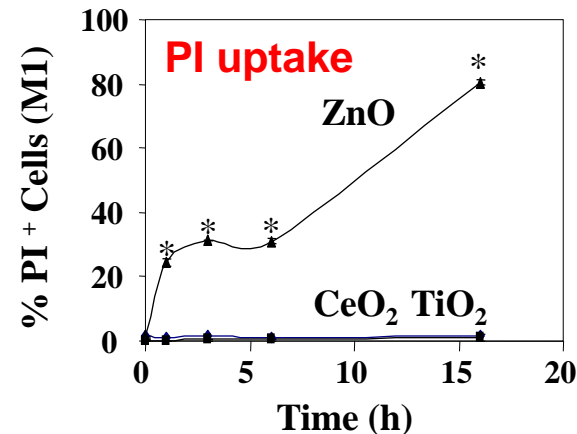
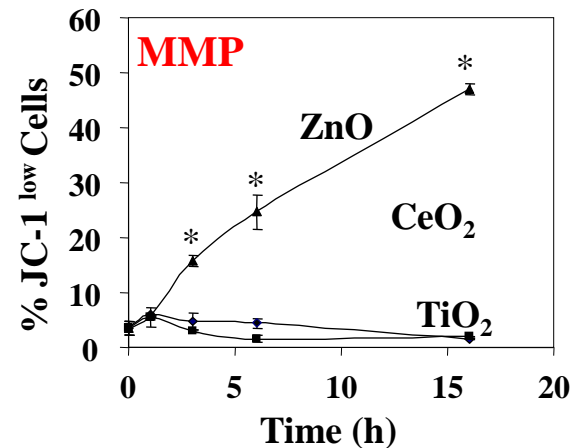
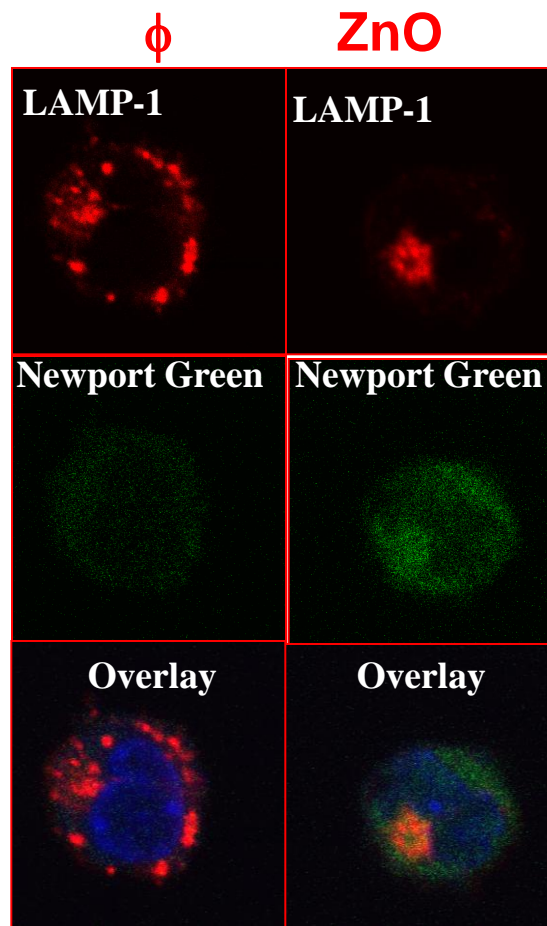
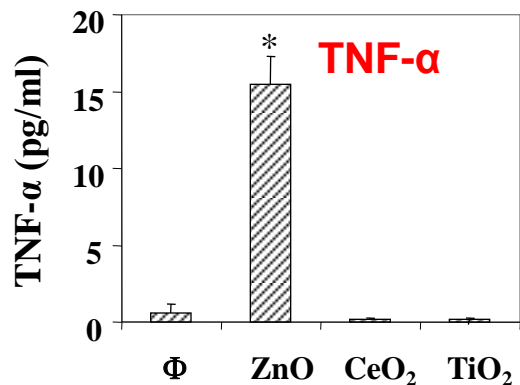
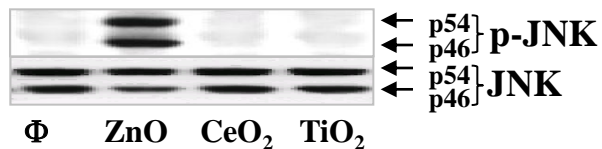
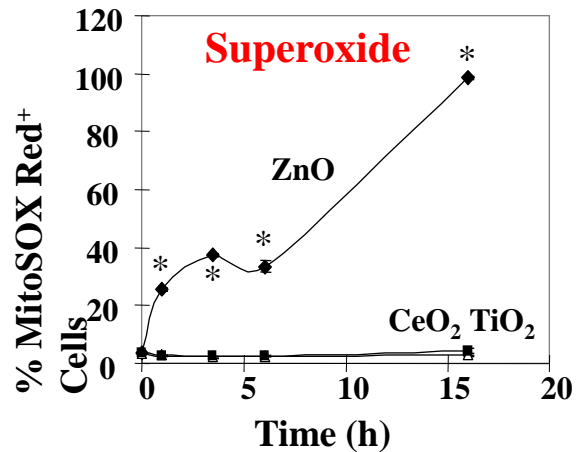
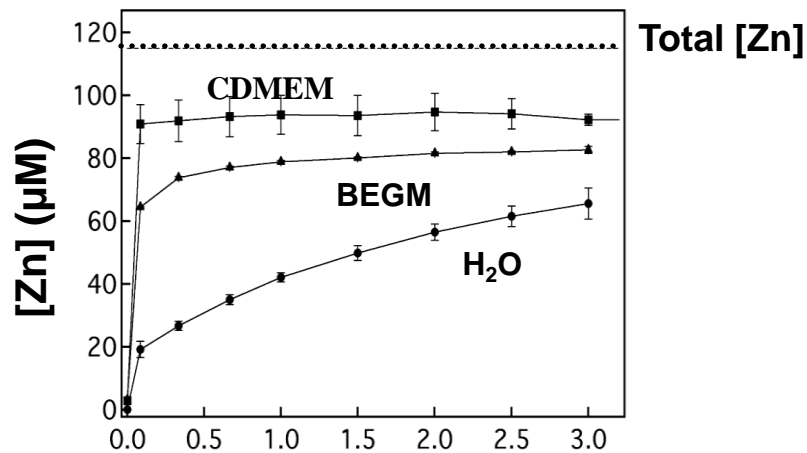
Resolves 24–48 hr after onset, no structural damage

Short-term tolerance: asymptomatic with repeated exposure

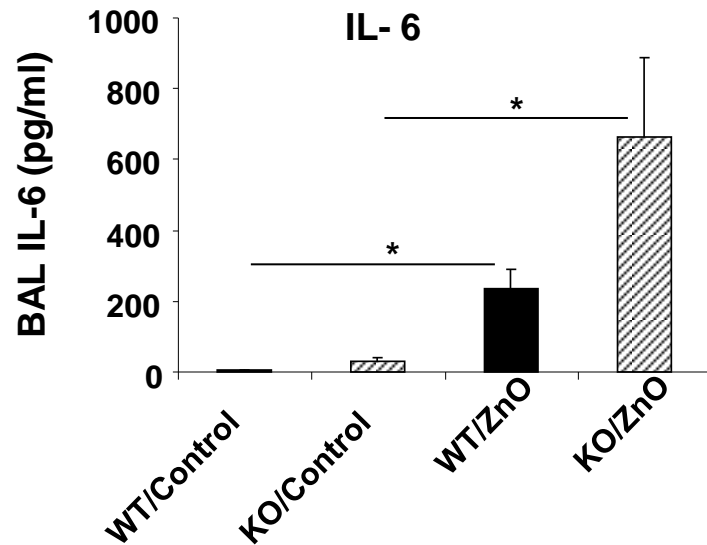
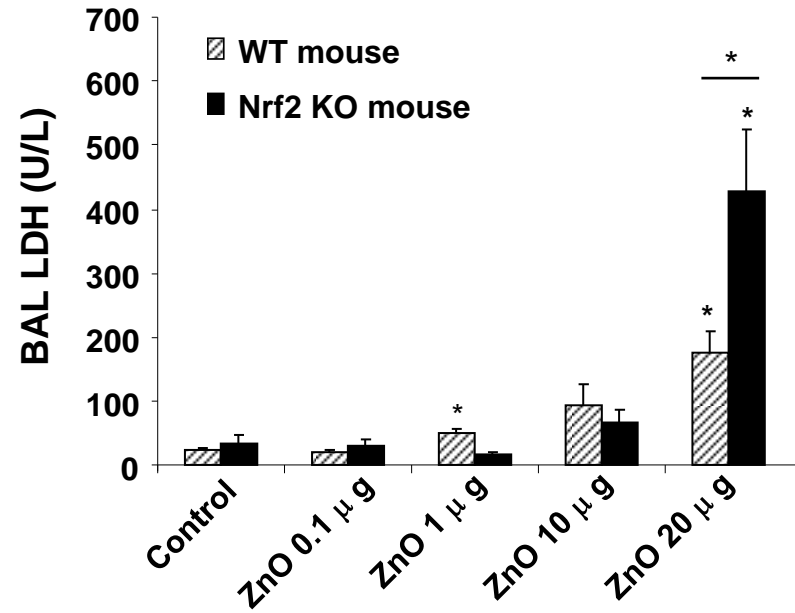
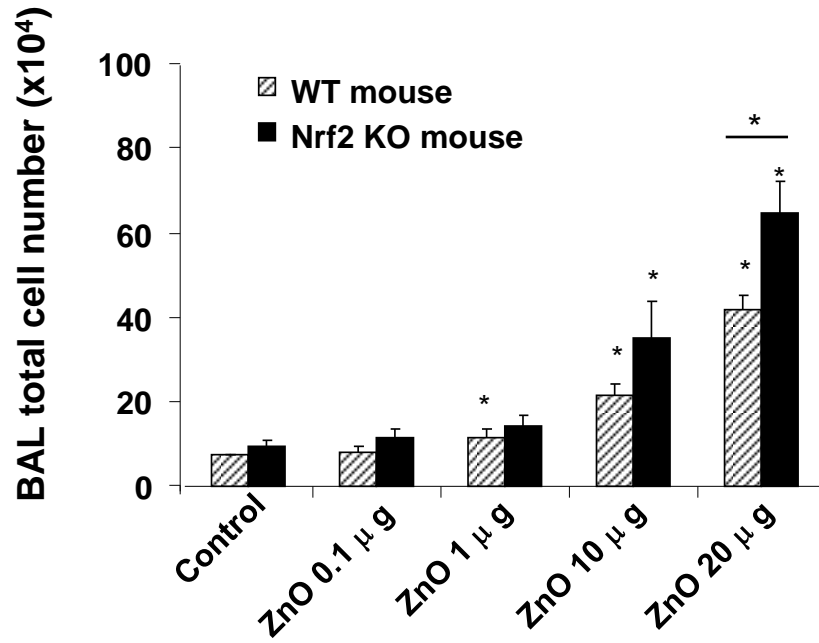


# ZnO dissolution chemistry and cellular toxicity

Xia et al  
ACS Nano



# Mouse studies showing *in vivo* linkage to cellular effects

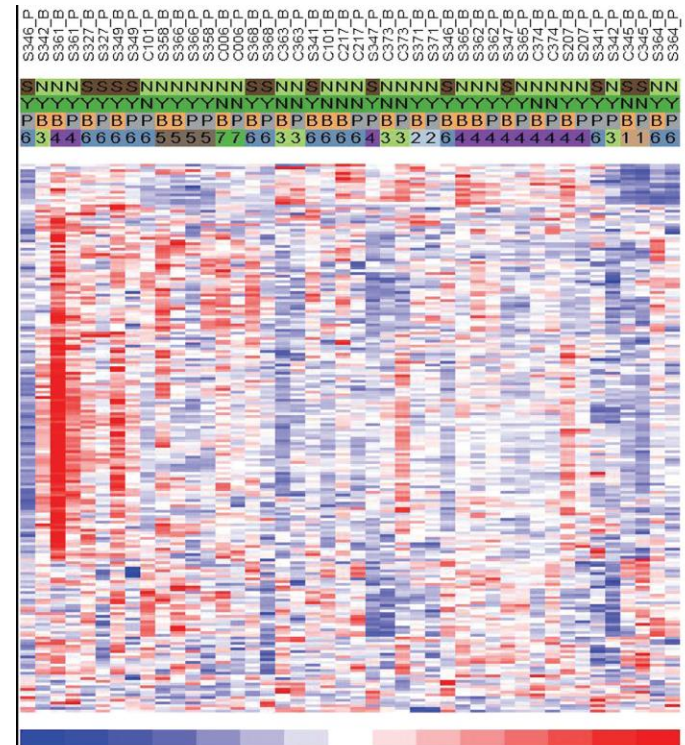


# Human Research Data in welders showing connection of mechanistic cellular data to in vivo oxidative stress effects and inflammation

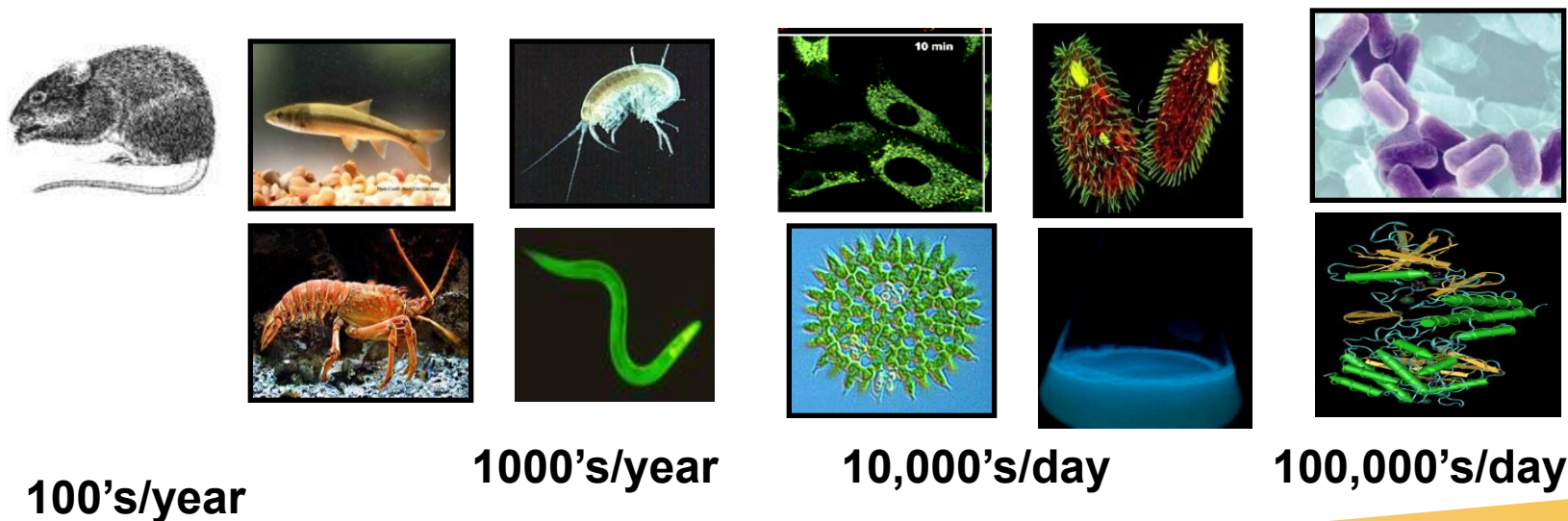
Microarray analysis of whole blood total RNA in boilermakers before and after occupational exposure to metal fumes

Genes with altered expression were clustered in biologic groupings that reflect induction of:

- inflammatory responses: esp IL-8
- oxidative stress
- signal transduction
- programmed cell death



## Predictive approach to environmental hazard assessment

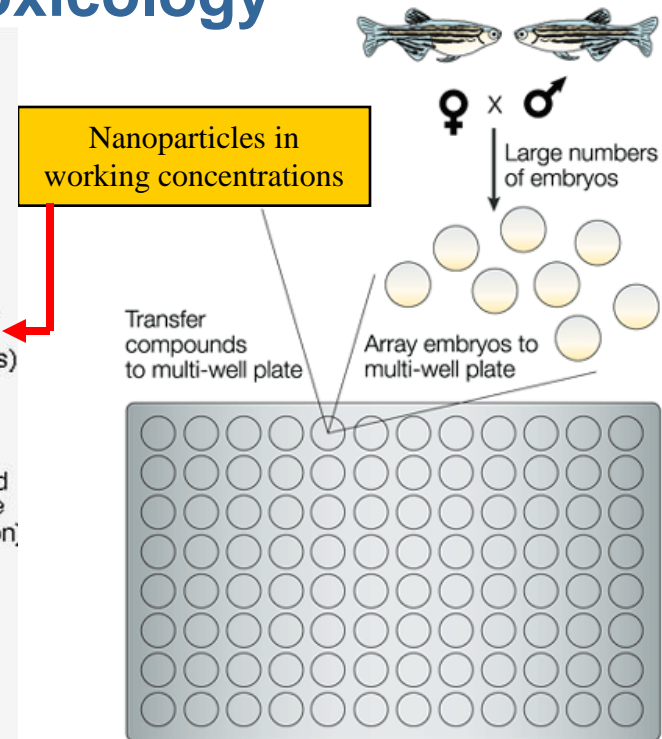
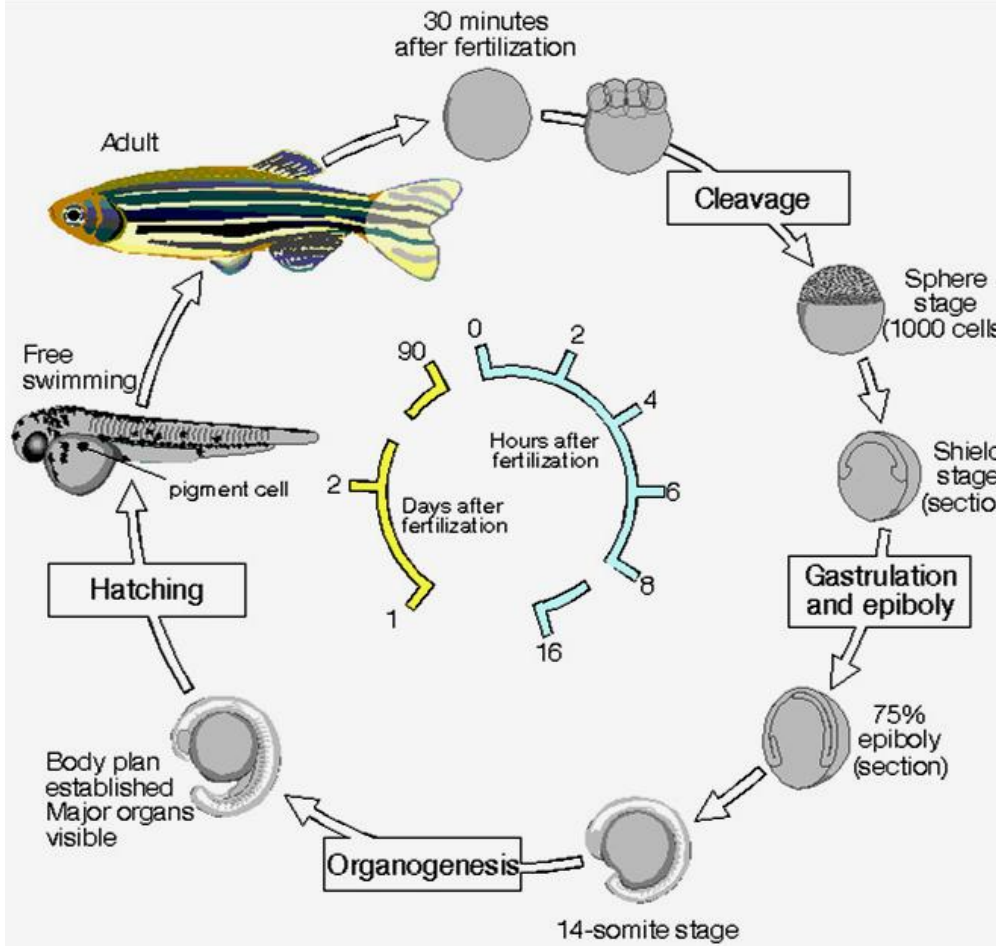


**High Throughput Bacterial,  
 Cellular, Yeast, Embryo or  
 Molecular Screening**

**Prioritize *in vivo* testing  
 at increasing trophic levels**

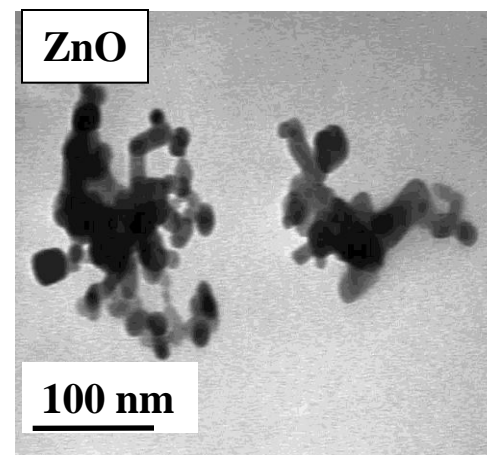
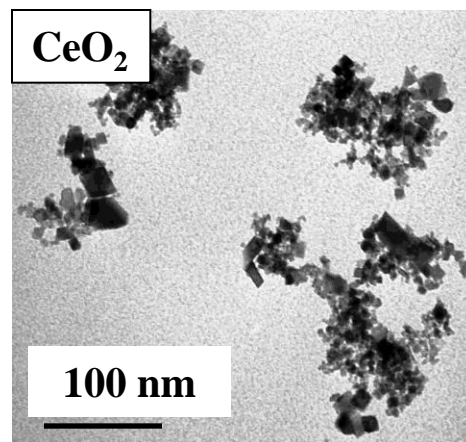
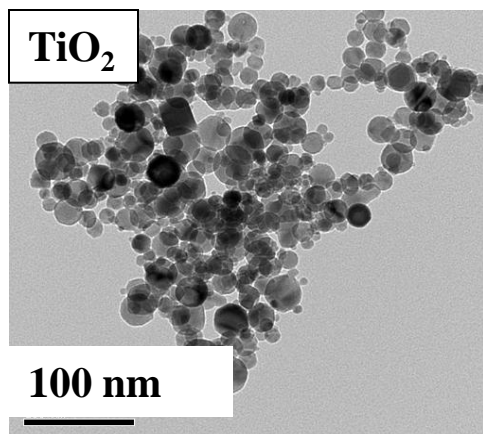


# Use of a Zebra fish model to perform Predictive Environmental Toxicology

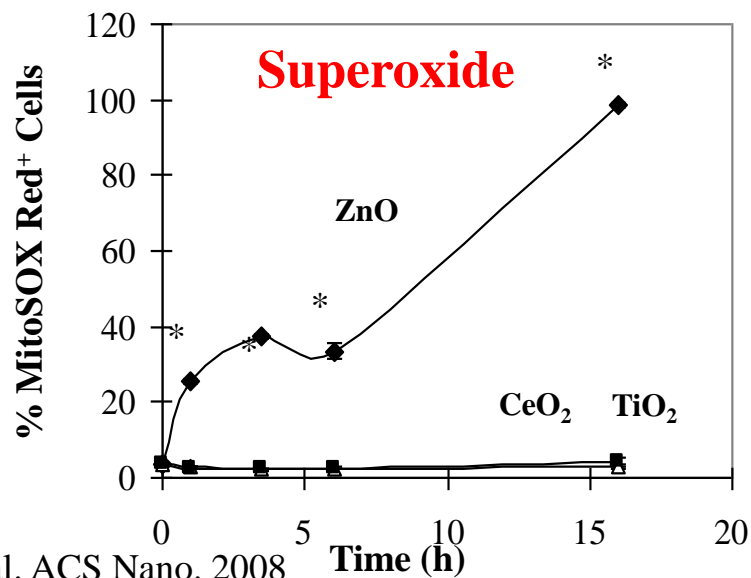


Observe and score for mortality rate, hatching rate, morphology and physiology

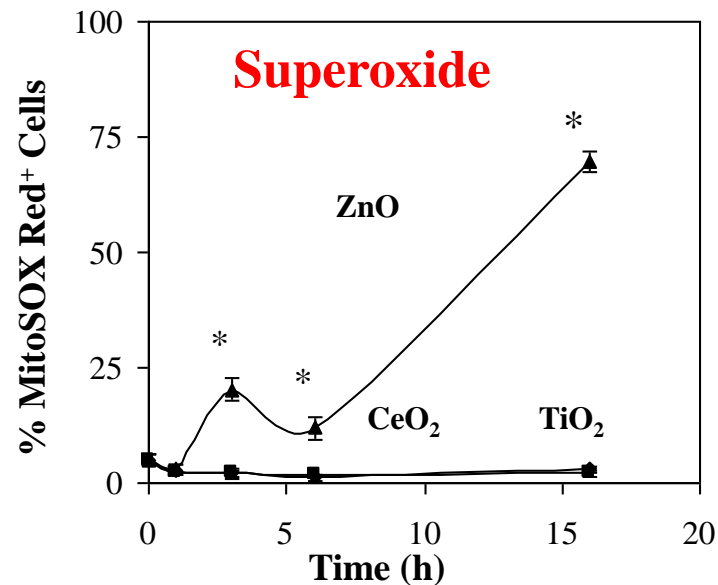
## Comparison three MeO *in vitro*



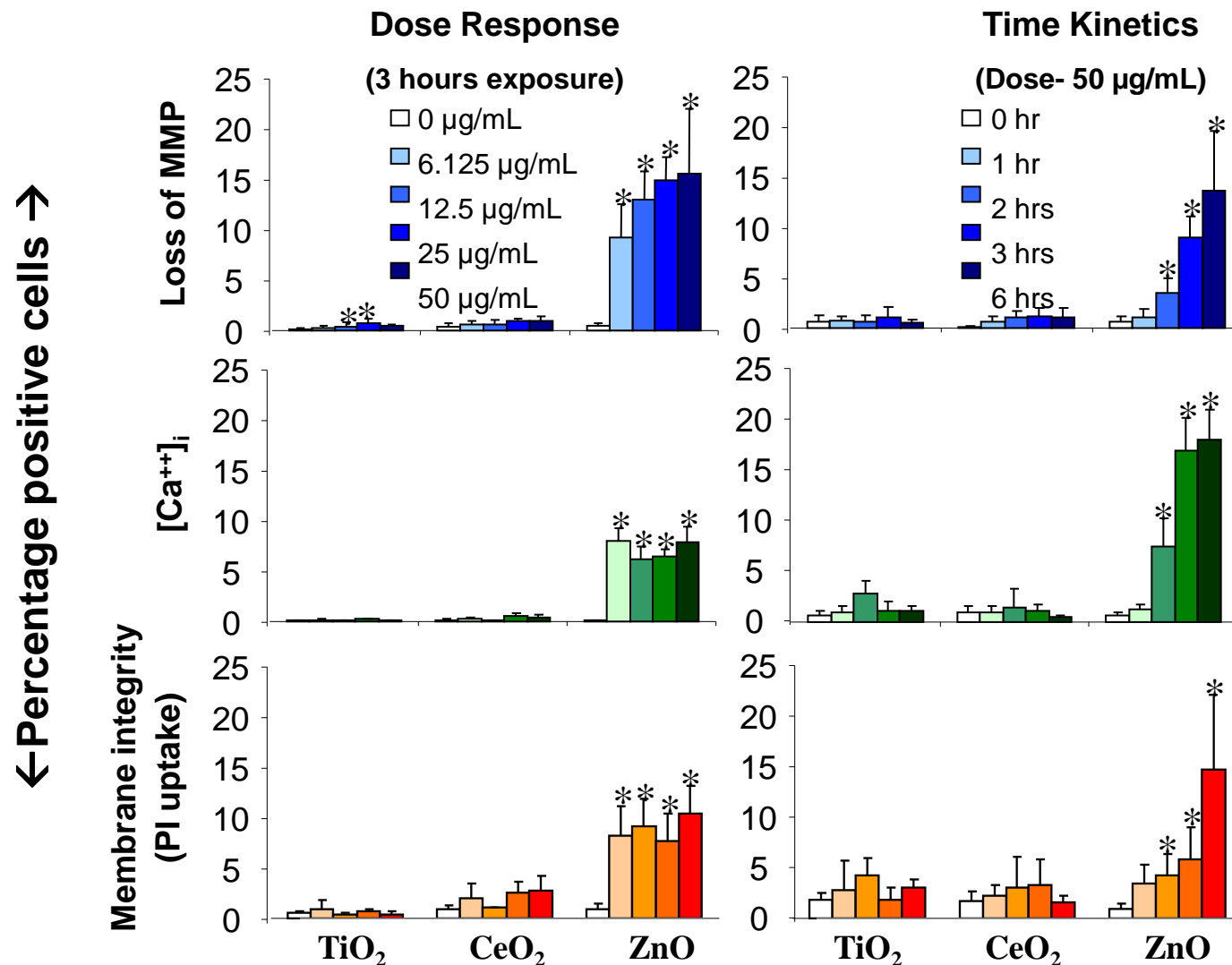
### Macrophage line



### Epithelial line

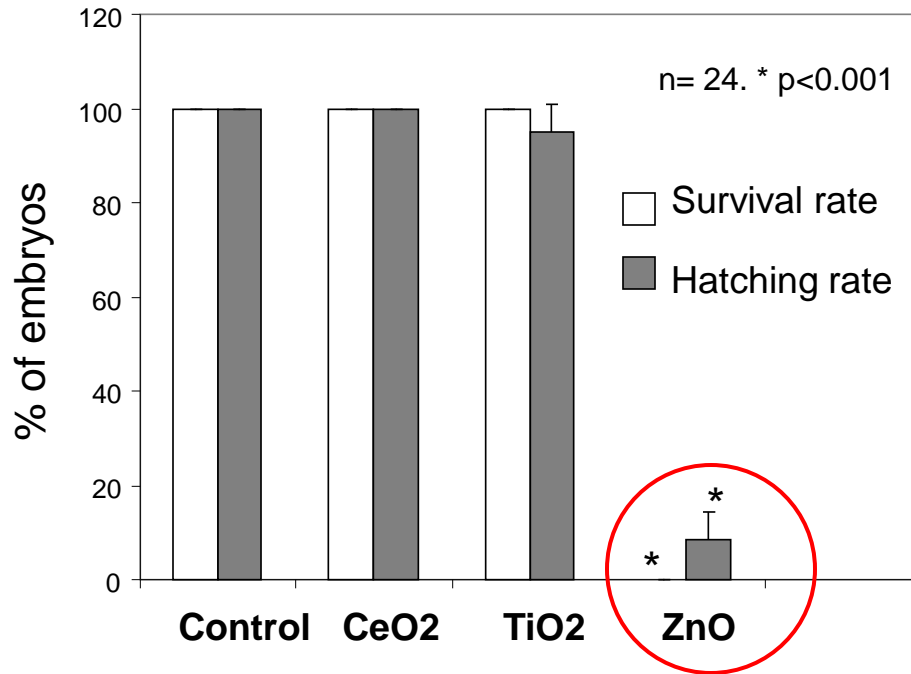


# Dose- and time- dependent rapid throughput cytotoxicity assay in BEAS-2B cells

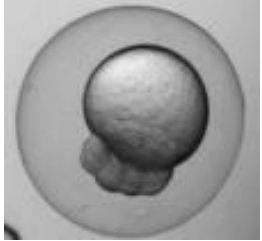


- ZnO showed dose and time dependent increase in all parameters of toxicity
- TiO<sub>2</sub> and CeO<sub>2</sub> showed no cytotoxicity

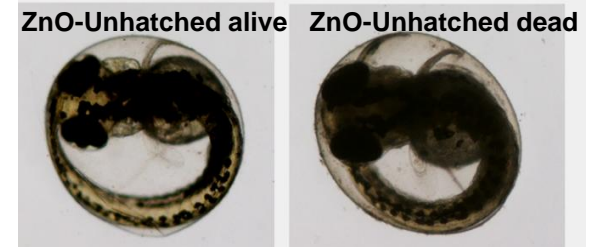
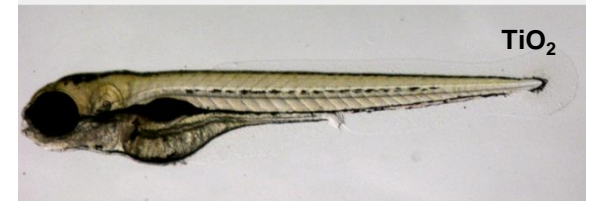
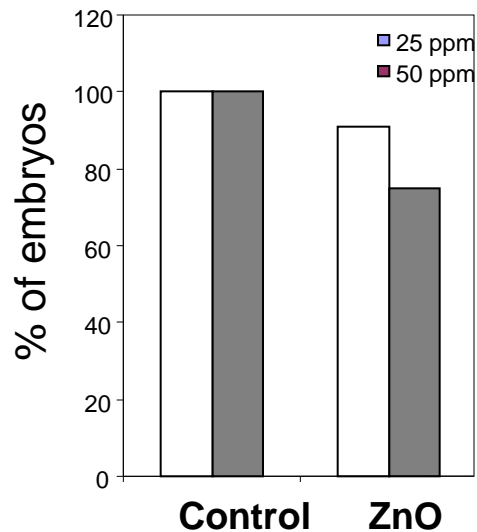
# Comparing the toxicity of the MeO library in Zebrafish



With Chorion



Without Chorion

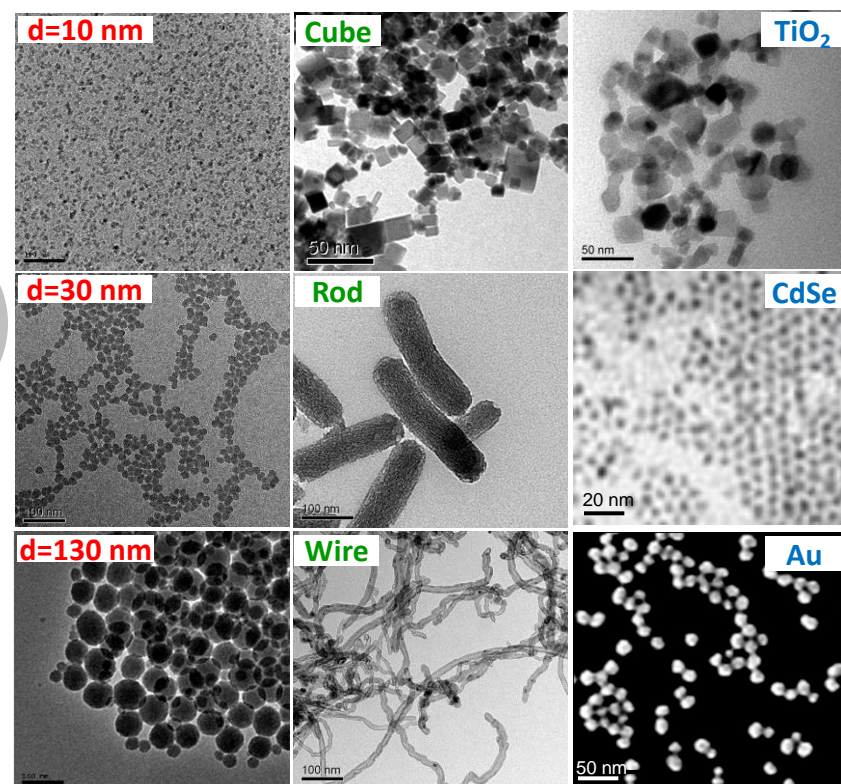
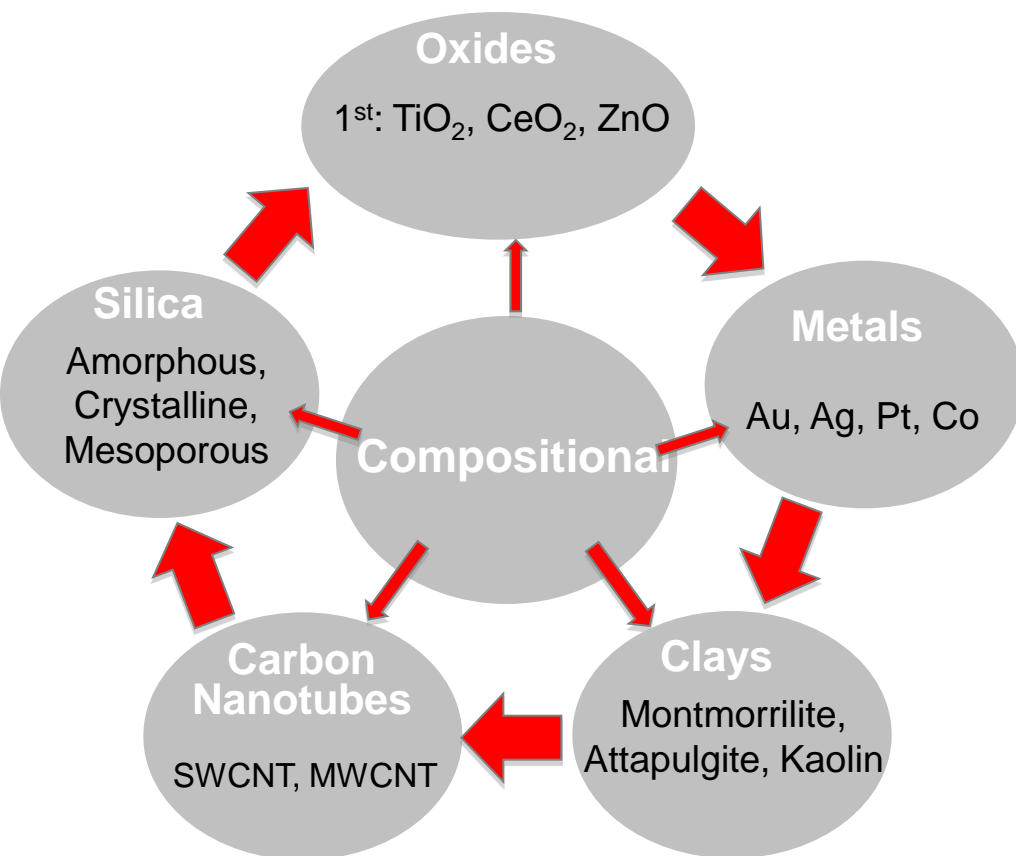




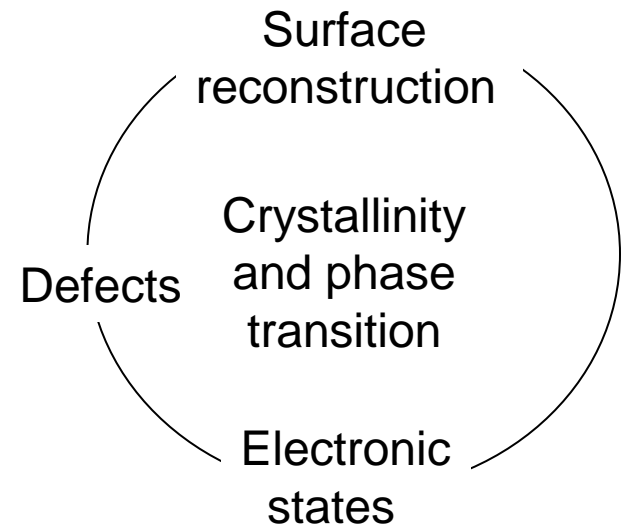
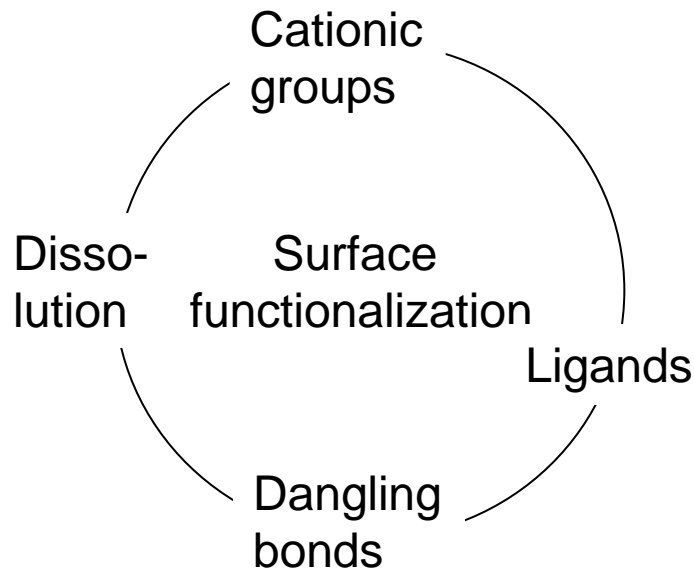
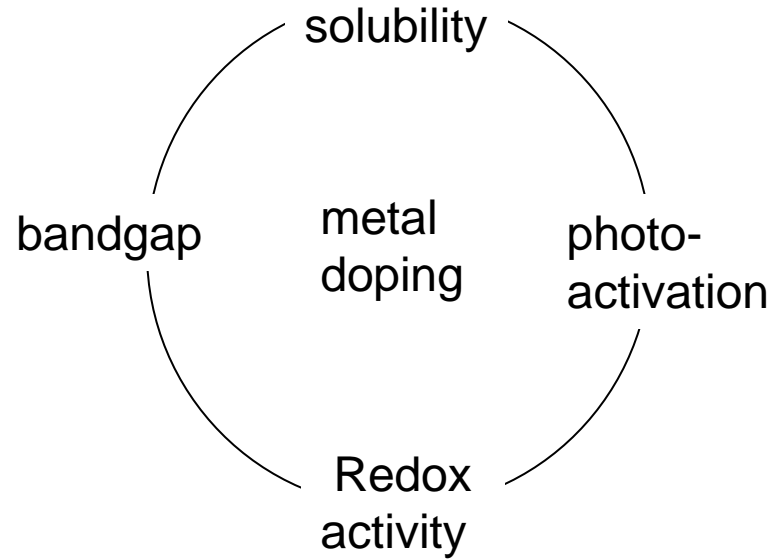
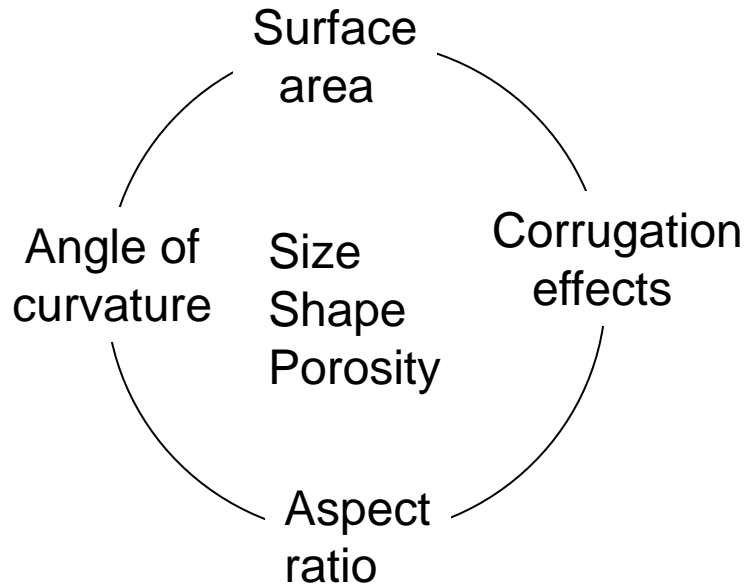
# What are the key ingredients for establishing a predictive science at the nano-bio interface?

1. The development of appropriate cellular and bio-molecular assays that can be used for predicting ENM hazard in intact animals
2. Development of compositional and combinatorial ENM libraries that can be used to explore property-activity relationships
4. Ability to perform high throughput screening to speed up knowledge generation
5. Computational analysis and nano-bioinformatics to deal with high volume data sets and ability to make predictions

# The use of Compositional and Property-based Nanomaterial Libraries to make discoveries at the nano-bio interface

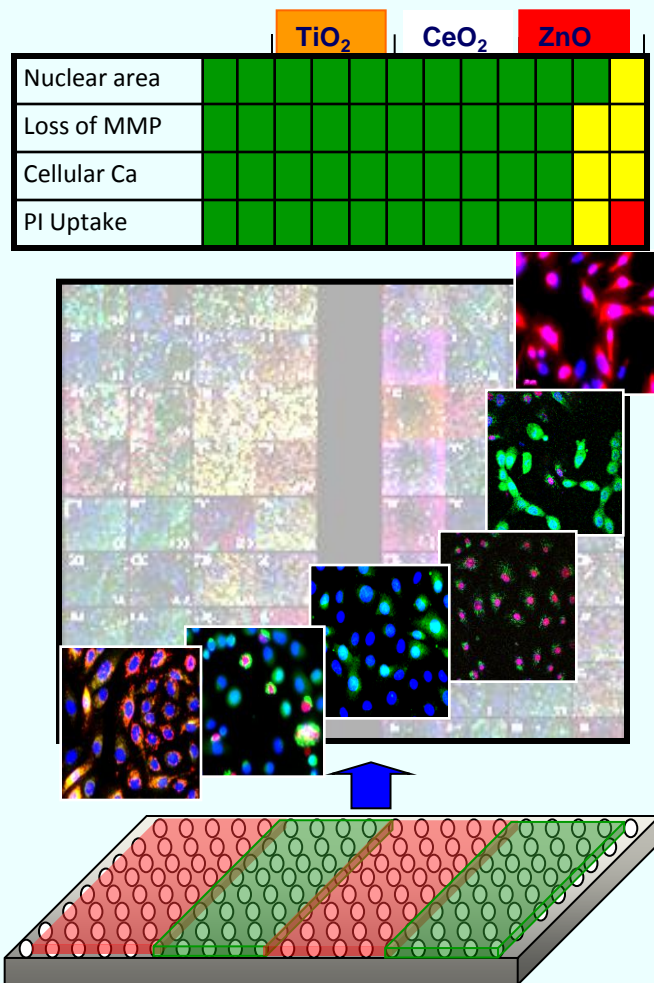


# Property Variations in Combinatorial Libraries



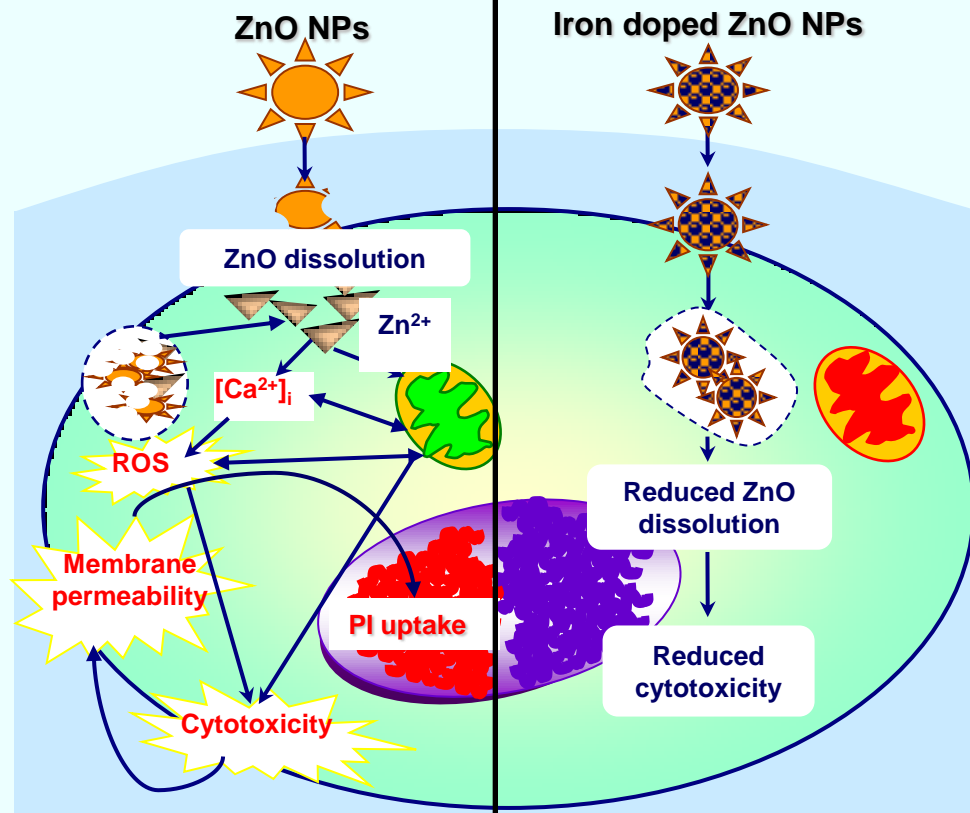
# Design of an Fe-doped ZnO library

## High throughput toxicity screening

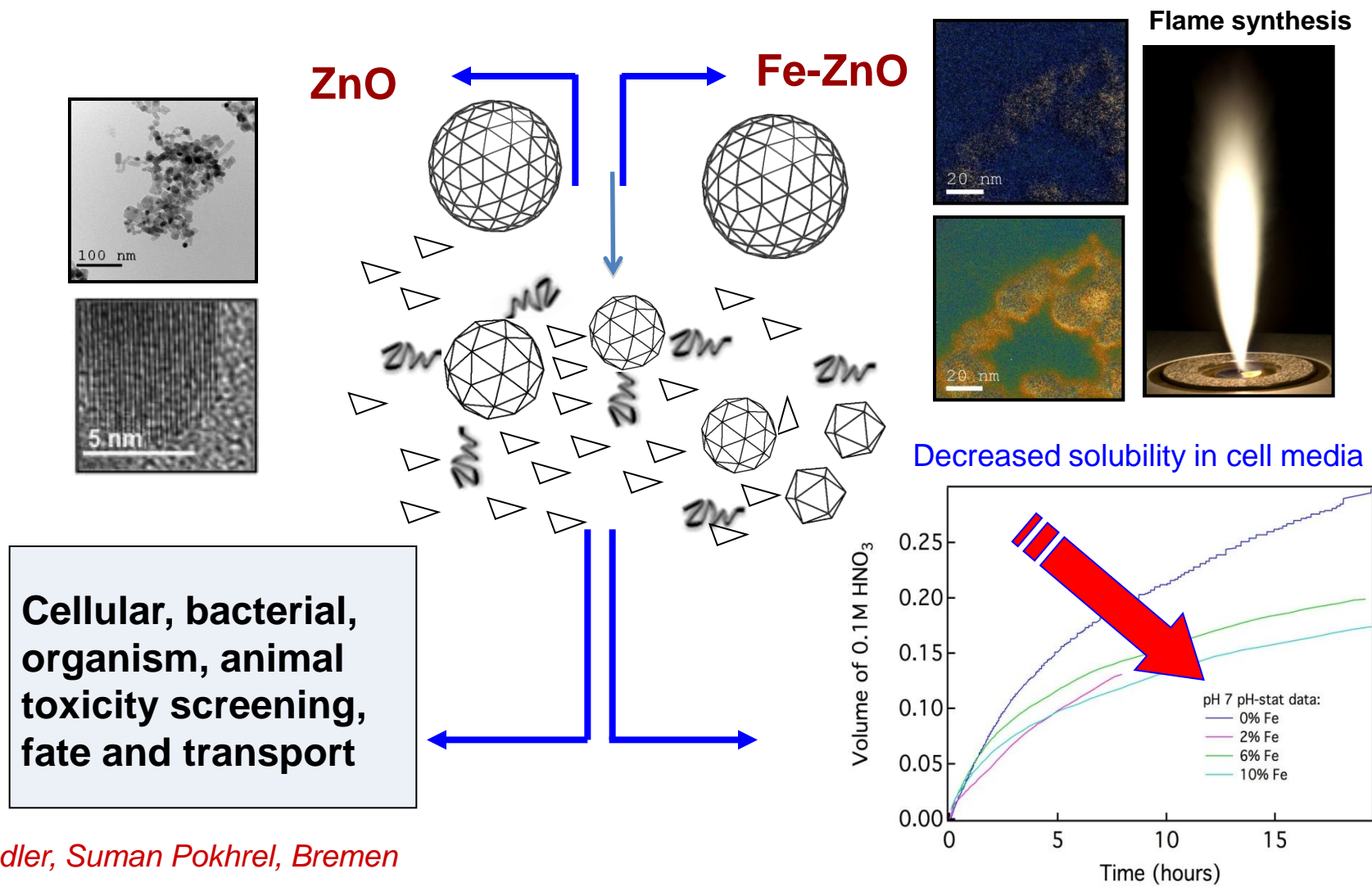


## Mechanism of ZnO nanoparticle toxicity

*George, S, et al ACS Nano, 2010, 4 (1), pp 15-29.*

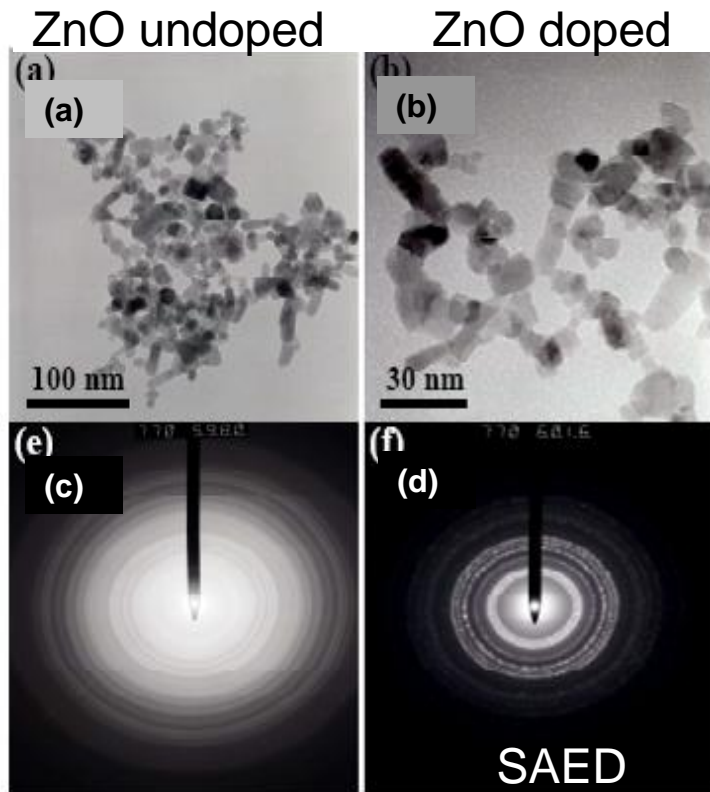


# ZnO-based Composition Library to Study the Role of Dissolution Chemistry in Toxicity

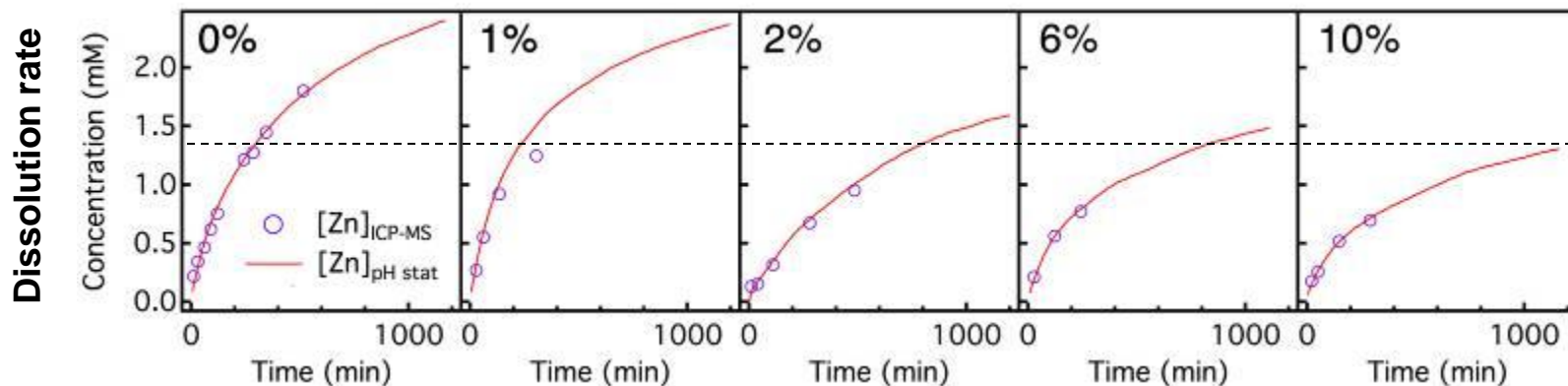
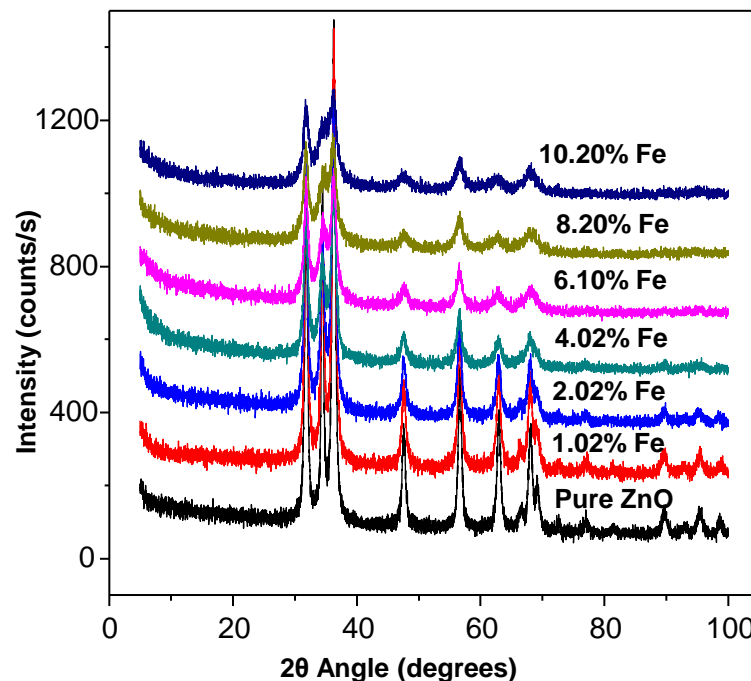




# Iron doping alters the matrix and yields slower dissolving ZnO NP

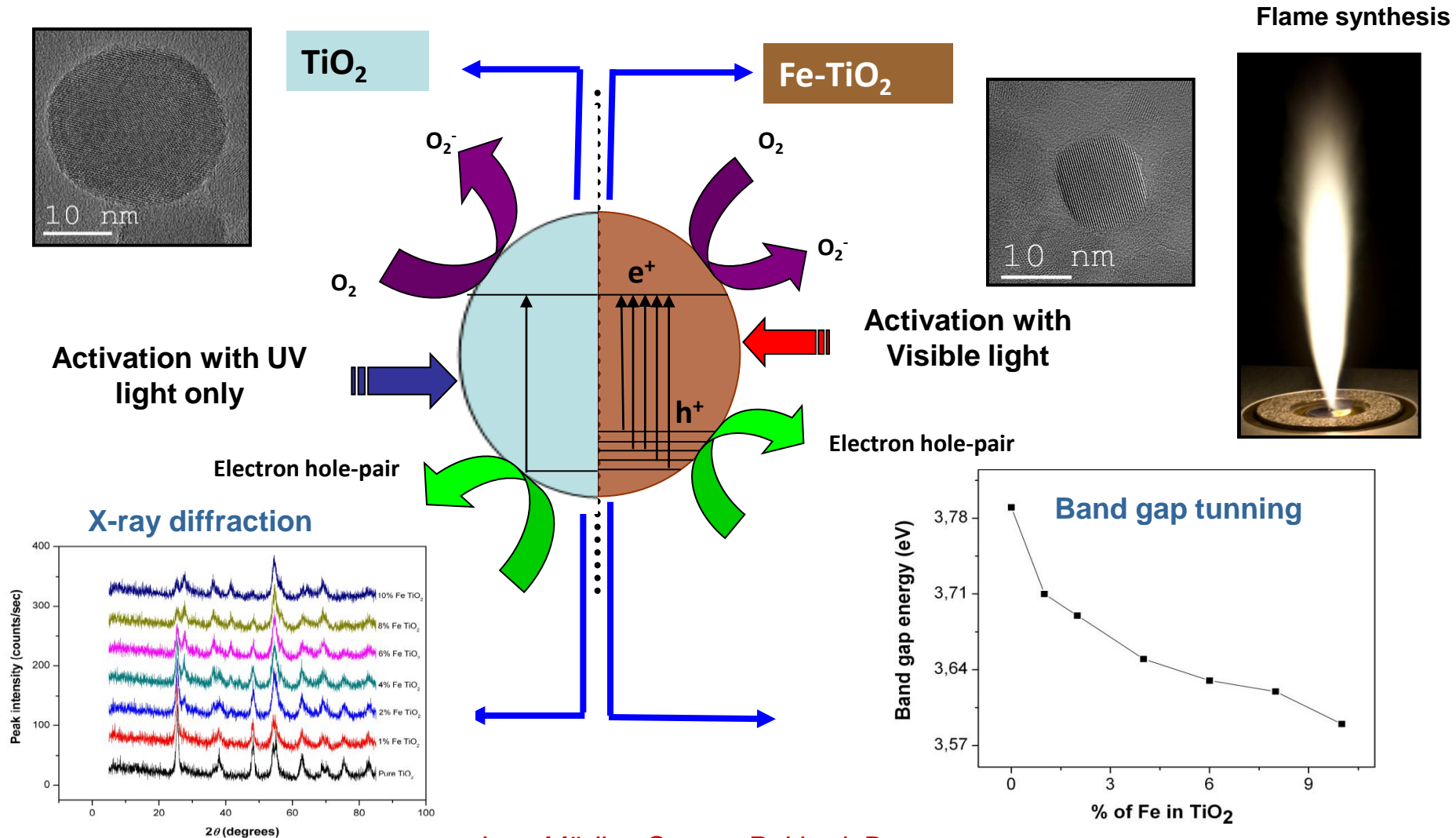


Particles synthesized by Lutz Maedler, Germany



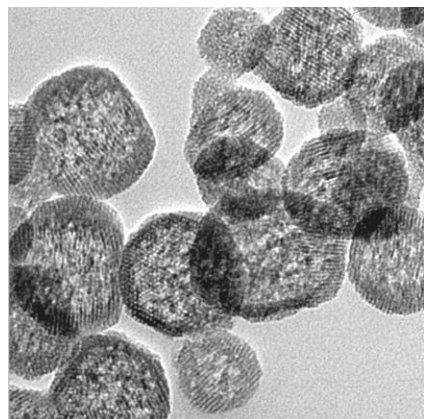
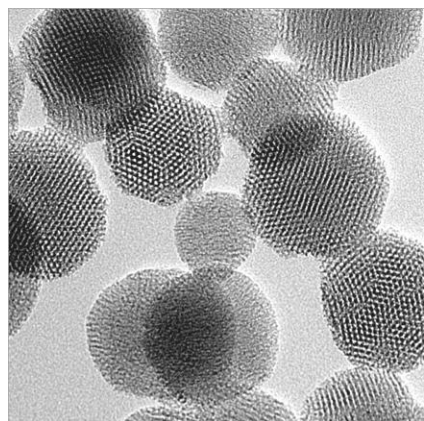
*IRG 3-1: Lenihan & Miller*

To study photoactivation by  $\text{TiO}_2$  mechanistically it is necessary to develop an ENM library that can be used under longer wavelength conditions: bandgap tuning by Fe doping





# Construction of a cationic MSNP library by coating with PEI



(PEI)

0.6 kD  
0.8 kD  
1.2 kD  
1.8 kD  
10 kD  
25 kD

MSNP-PEI 25 kD

MSNP-PEI 10 kD

MSNP-PEI 1.8 kD

MSNP-PEI 1.2 kD

MSNP-PEI 0.8 kD

MSNP-PEI 0.6 kD

MSNP

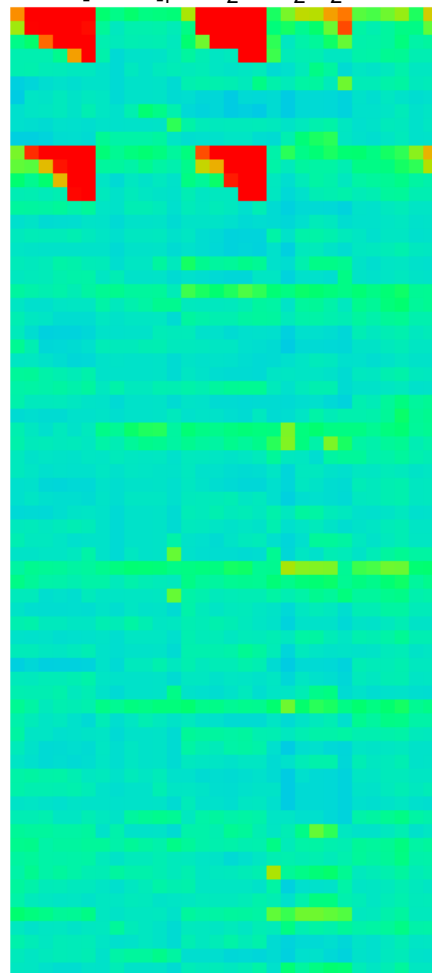
Cancer cell lines  
NHBE



PI  $[Ca^{++}]_i$   $O_2^{\cdot -}$   $H_2O_2$  MMP

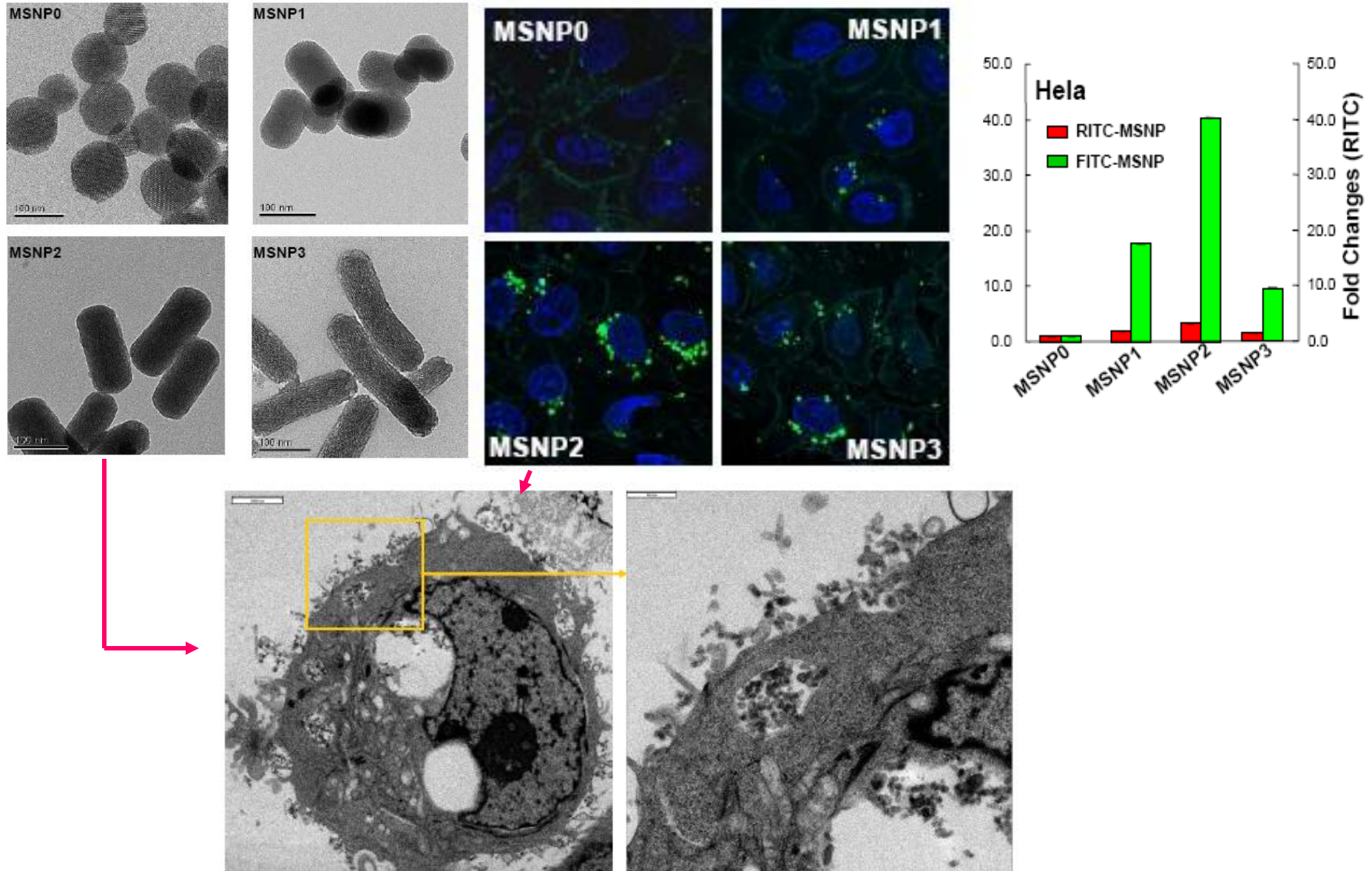
200  $\mu$ g/mL

0.2  $\mu$ g/mL



1h 6h

# Shape and Aspect Ratio Property Library shows that aspect ratio has a profound effect in active uptake tied to a specific Cellular activation mechanism



# What linkages can be used for high content data generation to prioritize *in vivo* assessment?

## Bio-Molecules

- Genes
- Proteins, etc

## Cellular injury responses

- Non-lethal
- Lethal

## Biological pathways

- Toxicological
- Signaling
- Death pathways

## Single cell or simpler life forms

## Animal pathology, disease

- Embryos
- Vertebrates
- Mammalian

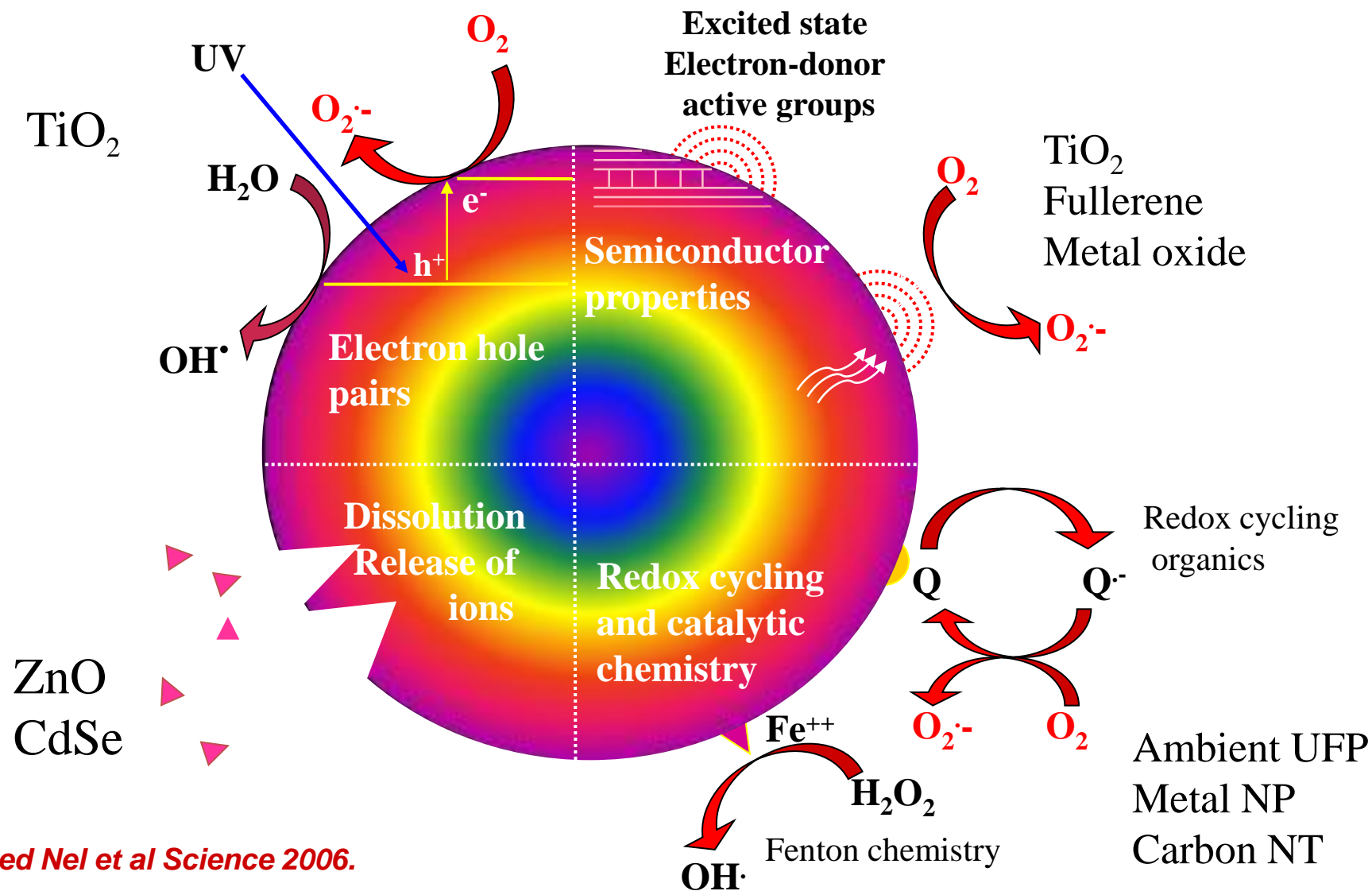
## Human health impact

## Impact on higher life forms, predators, populations and ecosystems

# Robust Screening Platform: Mechanistic Cellular Injury Pathways

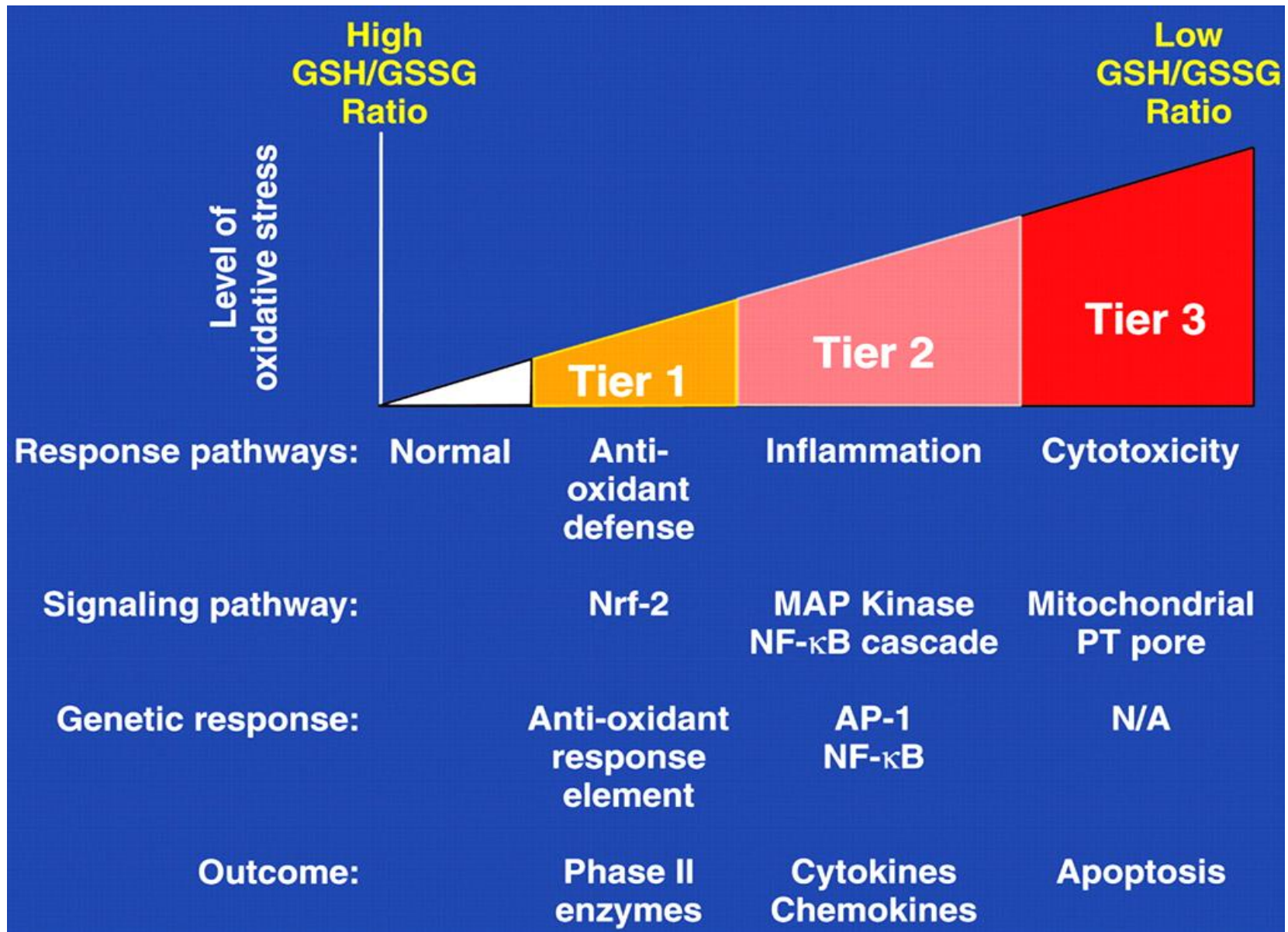
Toxicological Pathway	Example Nanomaterials
Membrane damage/leakage	Cationic NPs
DNA cleavage/mutation	Nano-Ag
Mitochondrial damage & apoptosis	ZnO, cationic NPs
Lysosomal damage: proton sponge effect frustrated phagocytosis	Cationic NPs CNTs
Fibrogenesis and tissue remodeling	CNTs
Blood platelet, vascular endothelial & clotting abnormalities	SiO <sub>2</sub>
Signaling cascades Inflammation, gene expression, survival	Metal oxide NPs, CNTs
Oxidative stress injury	CNTs, metal oxide NPs, cationic NPs

# Nanomaterial Mechanisms for Oxygen Radical production

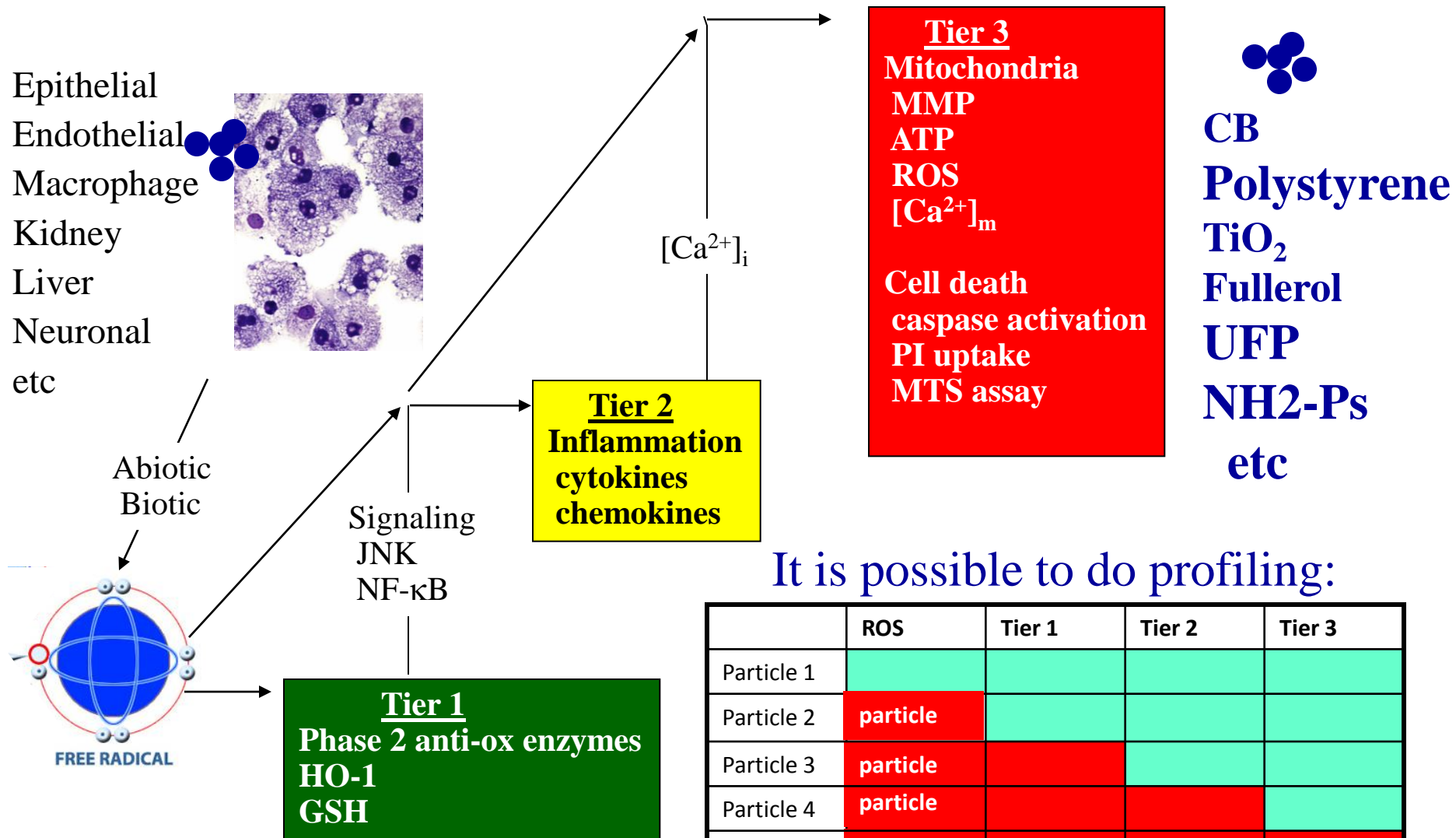




# The Hierarchical Oxidative Stress Model



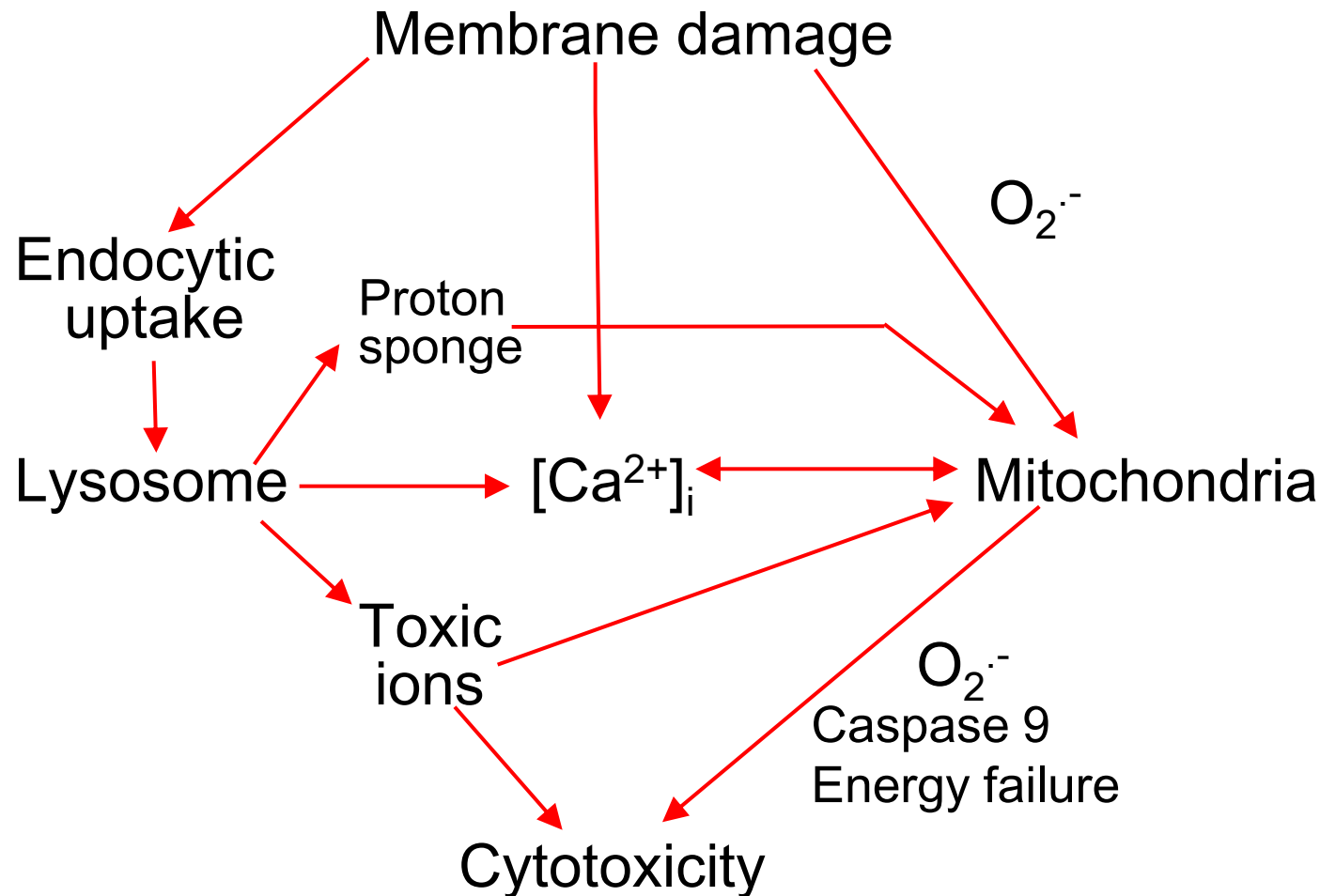
# In vitro comparison of a panel of nanoparticles based on the hierarchical oxidative stress paradigm



It is possible to do profiling:

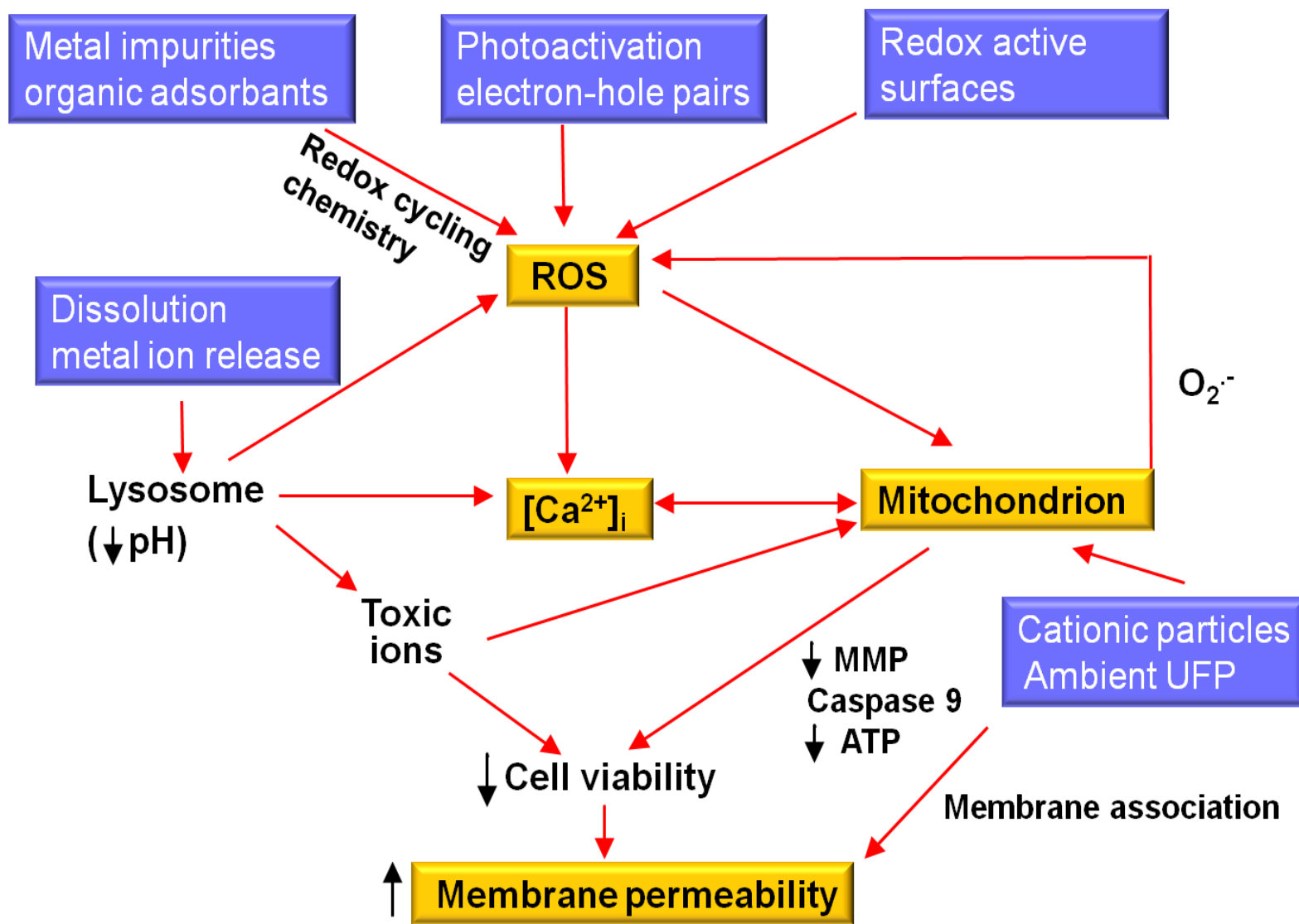
	ROS	Tier 1	Tier 2	Tier 3
Particle 1				
Particle 2	particle			
Particle 3	particle			
Particle 4	particle			
Particle 5	particle			
Particle 6	cell			

# Interconnected final common pathways of NM injury to screen for lethal and sublethal responses



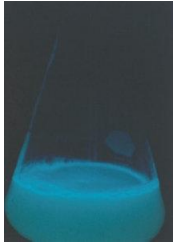


# Establishment of a Multi-parametric Assay

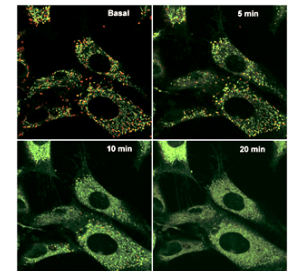


# Multi-parametric Oxidative stress High Throughput Screen

- ROS generation
- Mitochondrial membrane depolarization
- Cytotoxicity and PI uptake
- Intracellular Ca flux
- Cell localization / nucleus

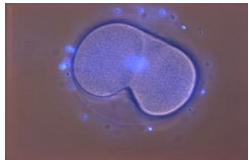


**Cells**  
**Bacteria**  
**Yeasts**  
**Embryos**

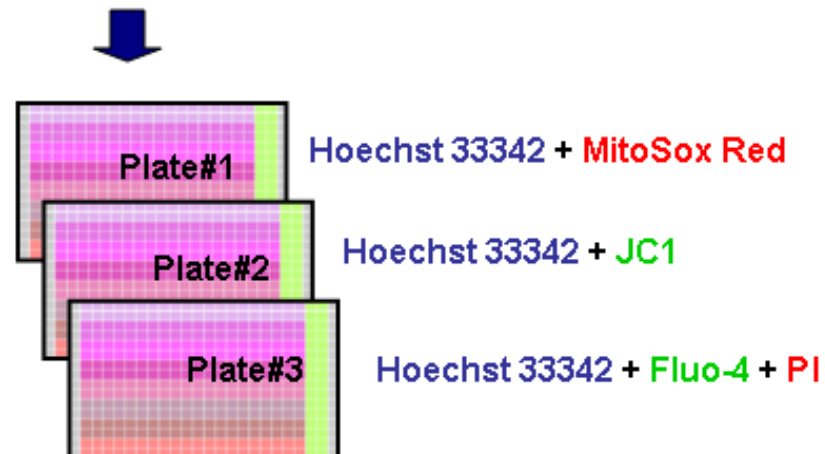
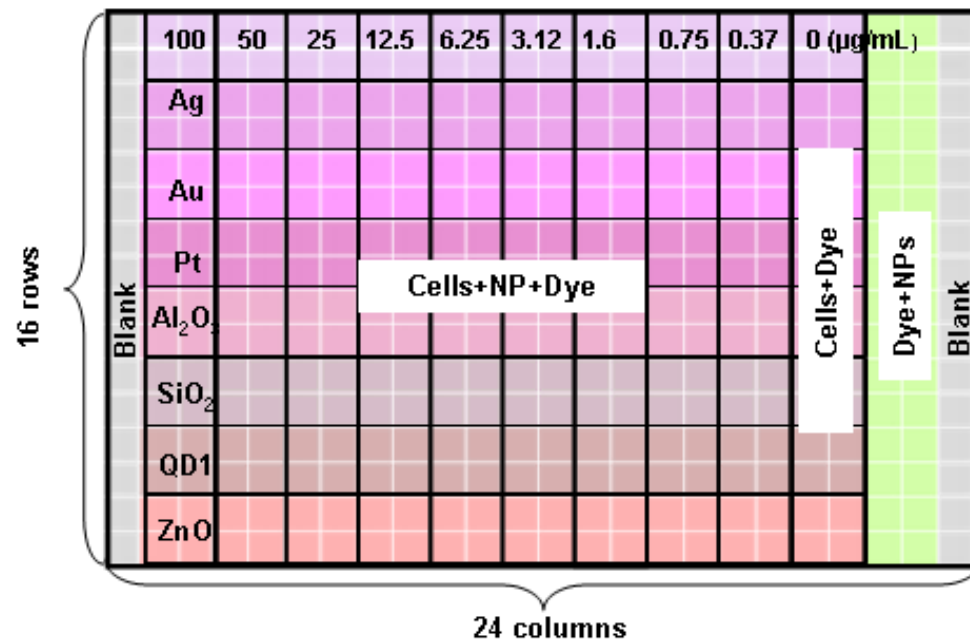


**Epi-fluorescence  
microscopy**

**Group Leader: Ken Bradley (UCLA)**  
**MSSR Director: Robert Damoiseaux**



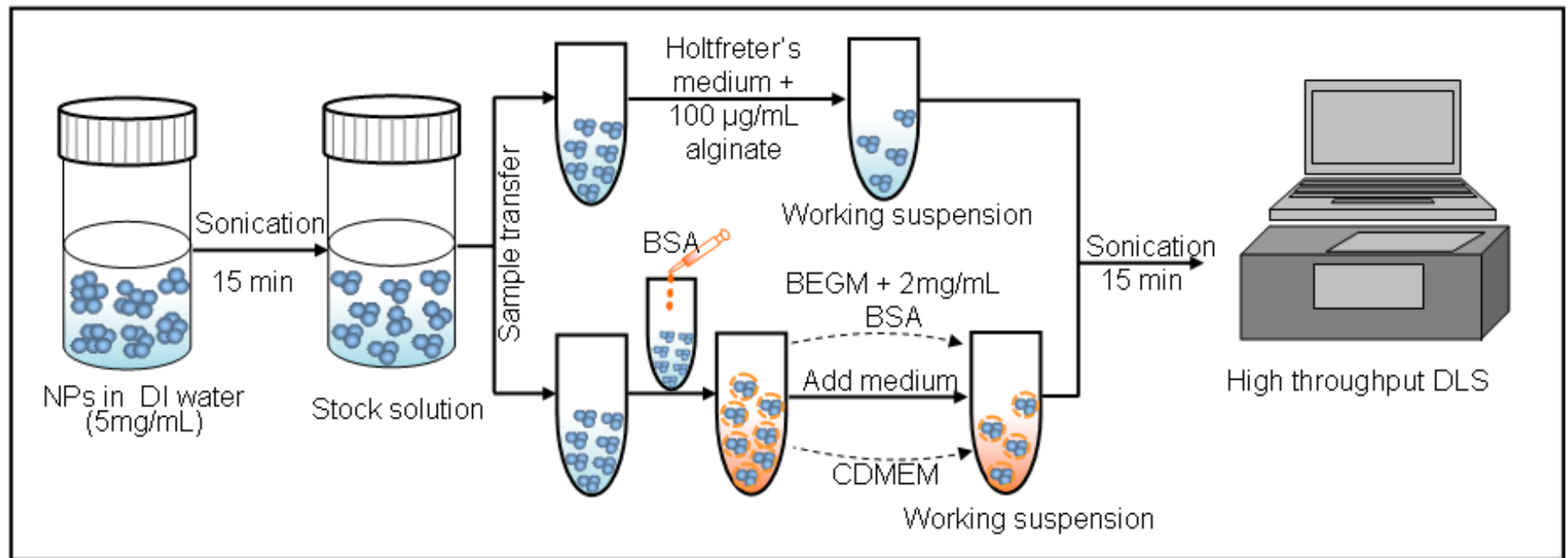
# Plate layout for each cell type



# HTS of a Metal and Metal compositional series

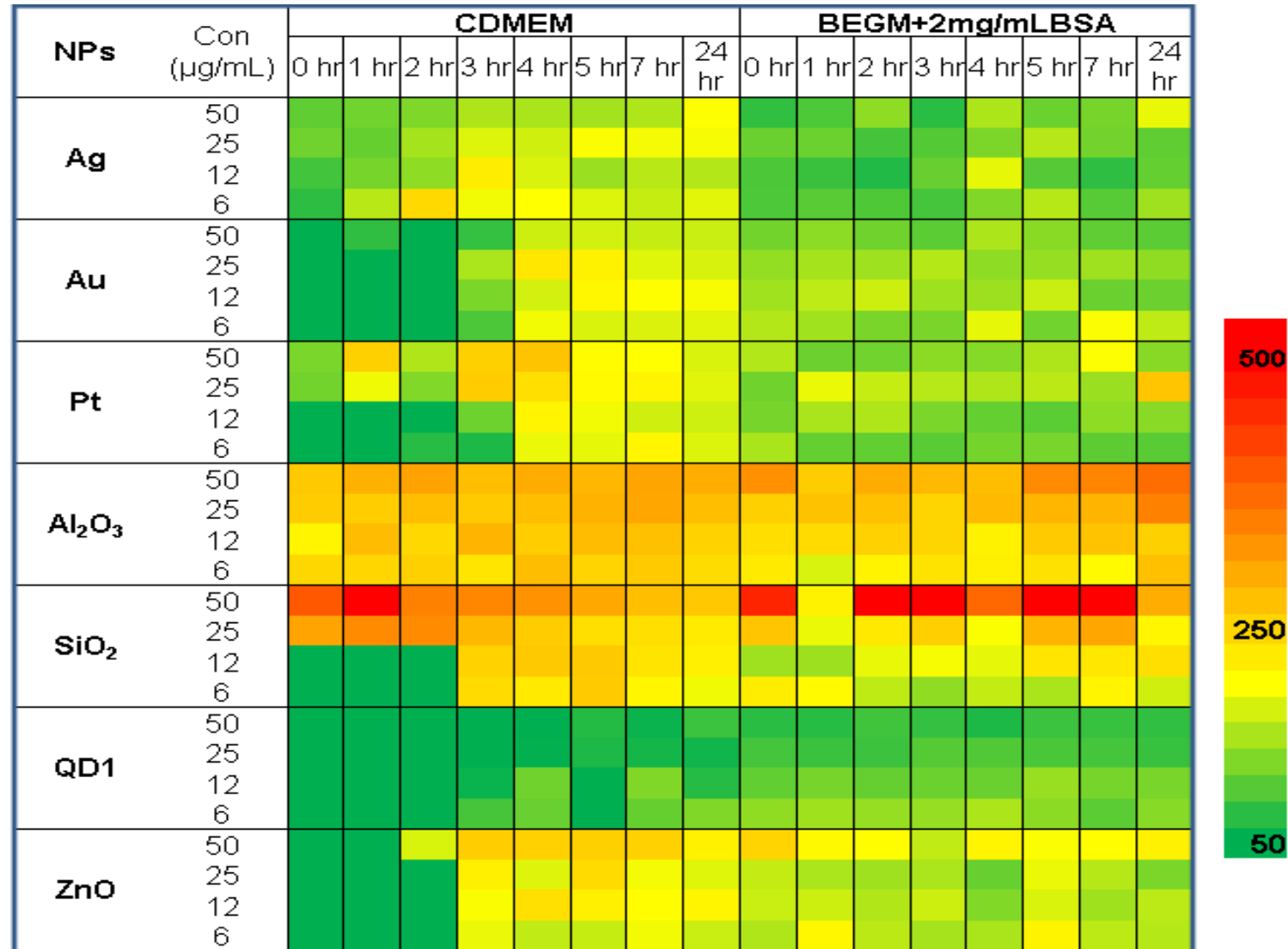
NMs	Size (nm)			Zeta potential (mV)		
	Water	CDMEM	BEGM+BSA (2mg/mL)	Water	CDMEM	BEGM+BSA (2mg/mL)
Ag	95.68	77.17	110	-30.7	-10.2	-8.77
Au	294.45	21.9	29.1	-17.4	-6.15	-1.93
Pt	271	28.6	173	-34.1	-9.26	-8.58
Al <sub>2</sub> O <sub>3</sub>	1168	25.8	57	-8.77	-10.6	-8.47
SiO <sub>2</sub>	1135.35	22.6	67.91	-31.6	-6.54	-10.4
Qdot-T	168.5	48.5	443.2	78.4	-10.3	-10.1
ZnO	130.5	24.23	45.17	17.4	-7.16	-7.93

# HTS requires high throughput methods to assess particle suspension and stability

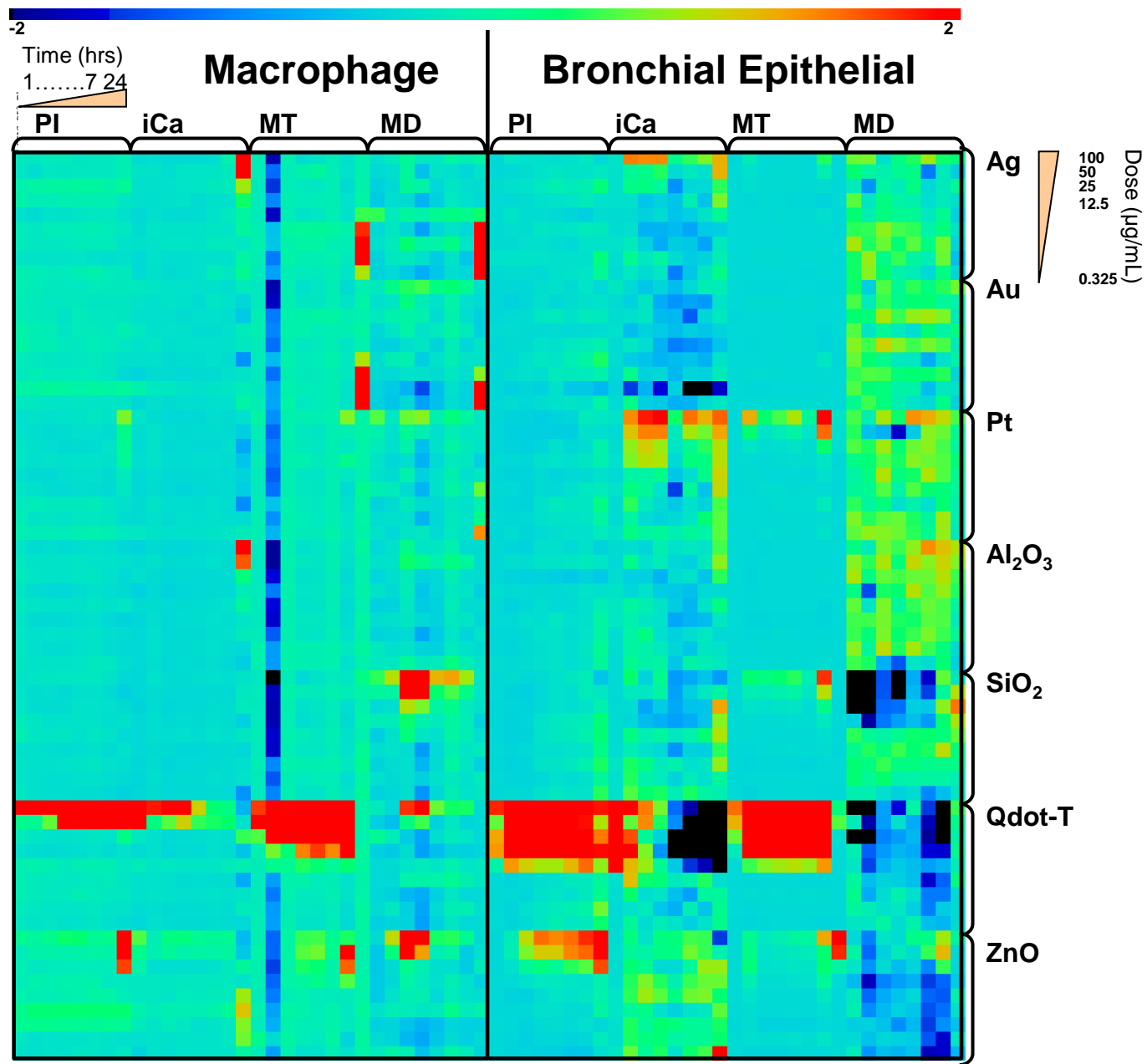




# High Throughput DLS of the Kinetics of NP agglomeration in mammalian tissue culture media



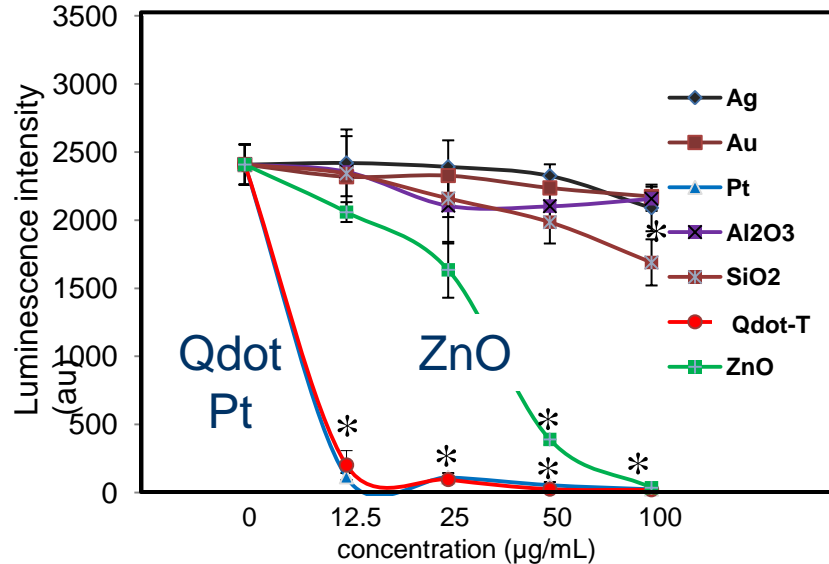
# Heat Map of the multi-parametric data (z-score transformation)



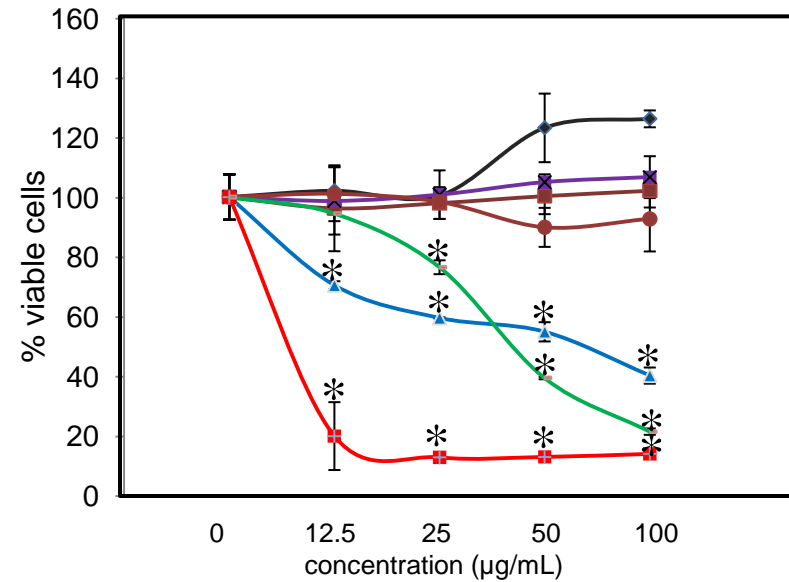
# Comparison of multi-parametric data to individual responses assessment

ATP measurement

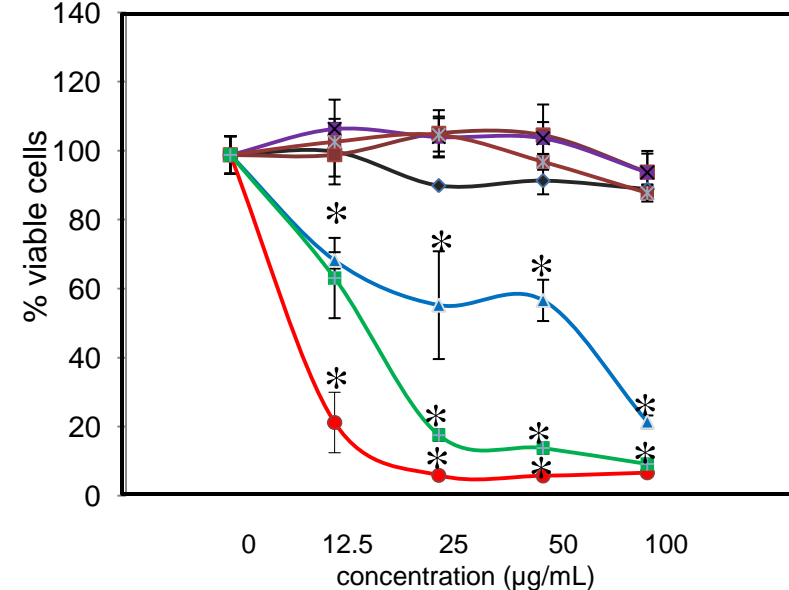
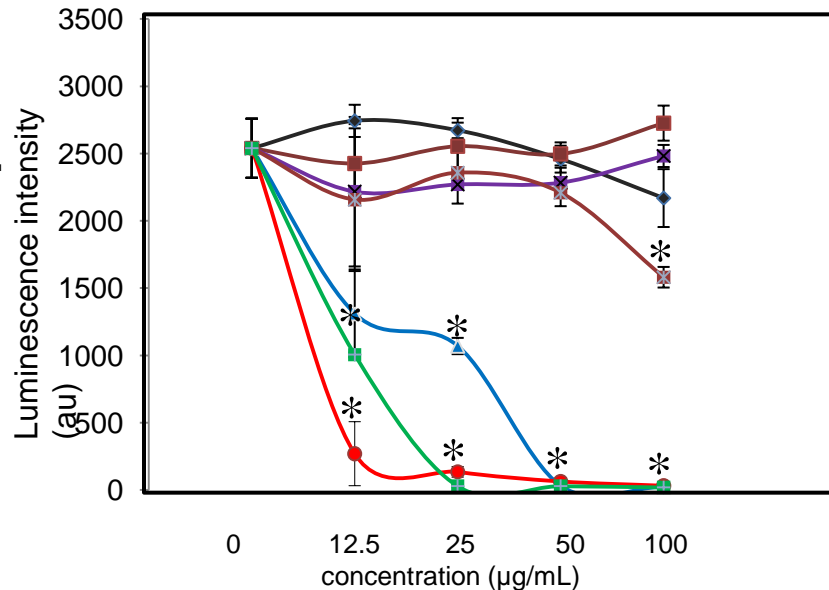
Macrophage



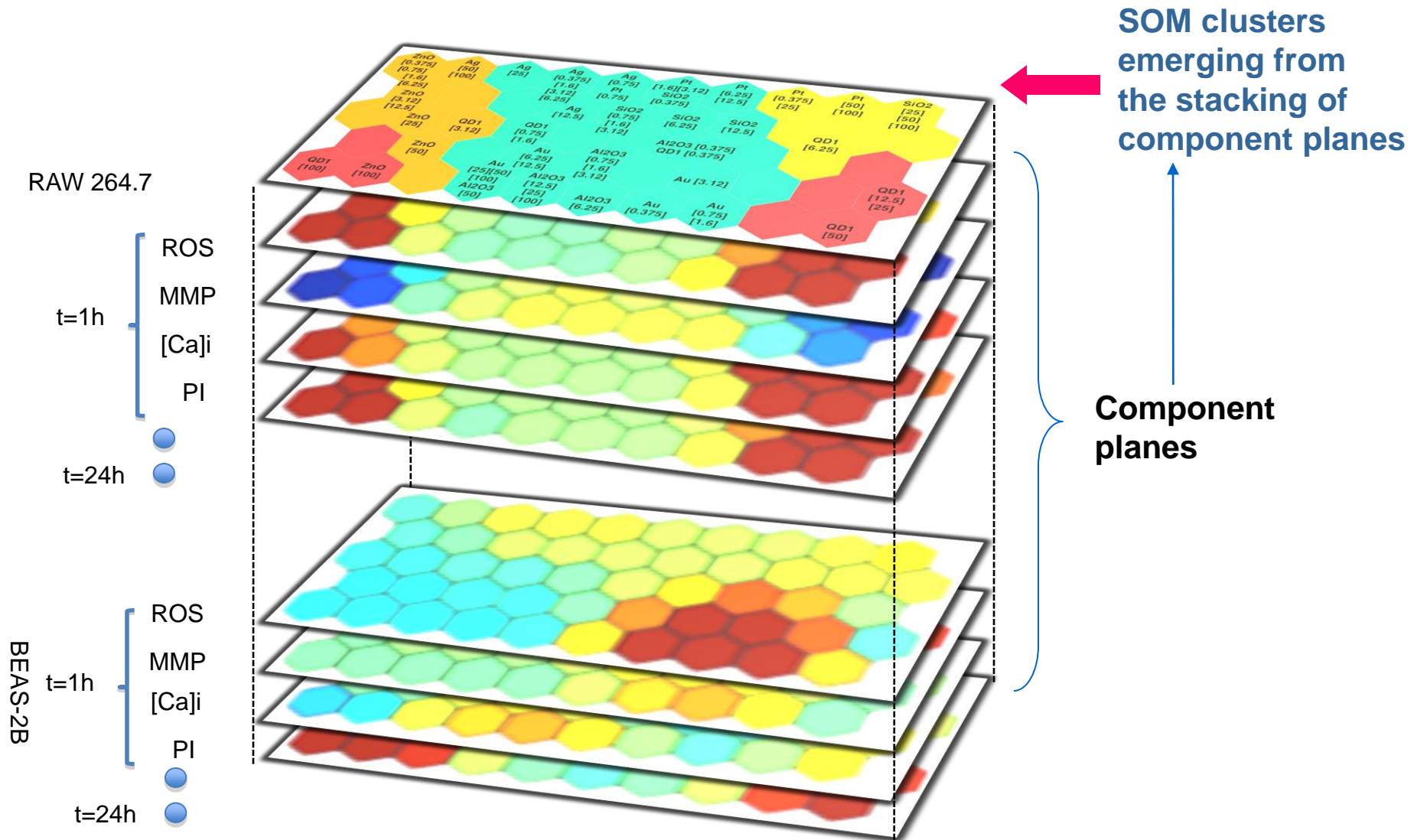
Cell viability by MTS assay



Bronchial Epithelial

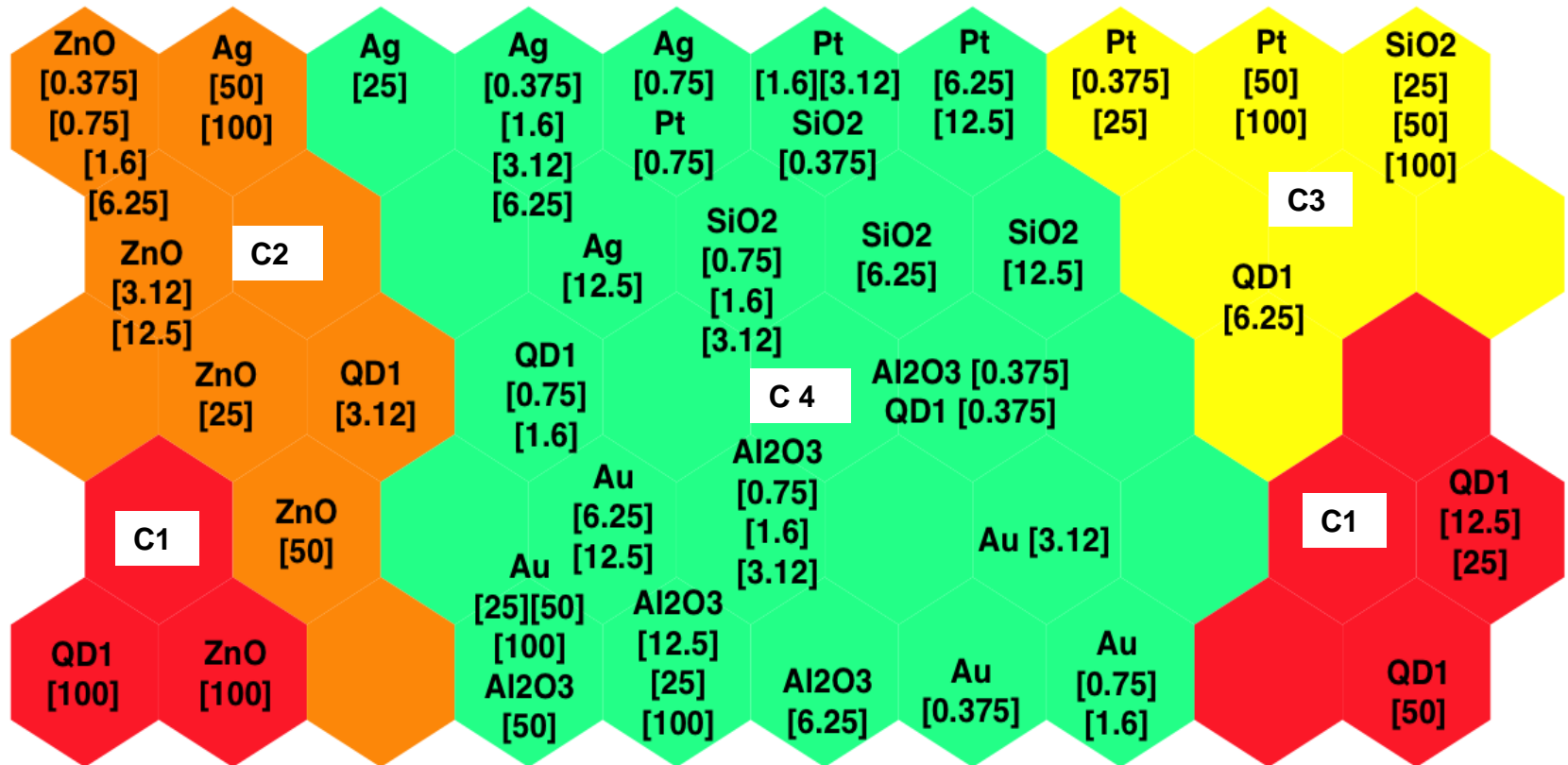


# Advantage of Multi-parametric testing: Revealing hidden relationships



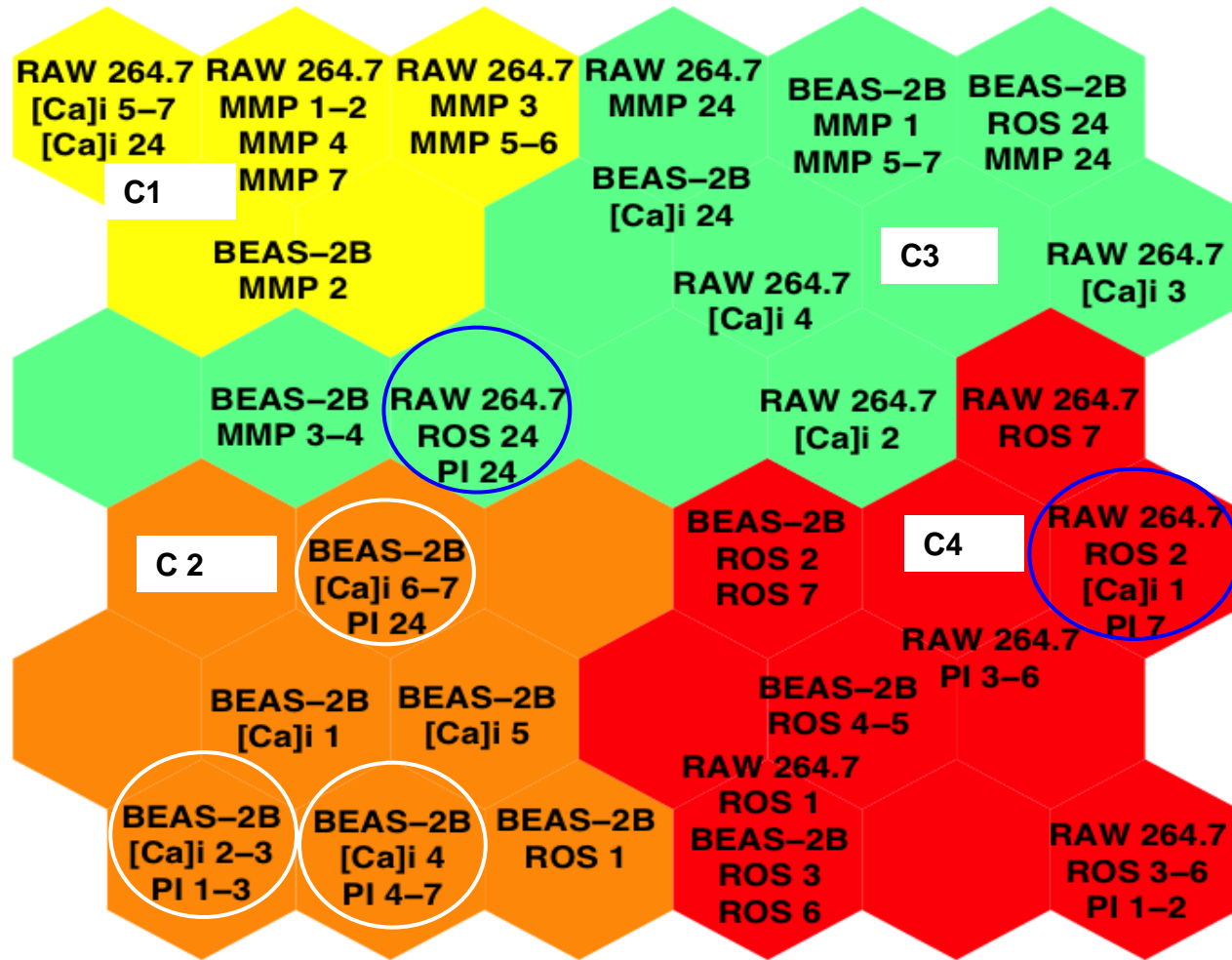
2D visualization of the relationship between all cytotoxic parameters, all doses, time points and for all particles

# SOM defined by similarity in cytotoxic response profiling for the entire data set



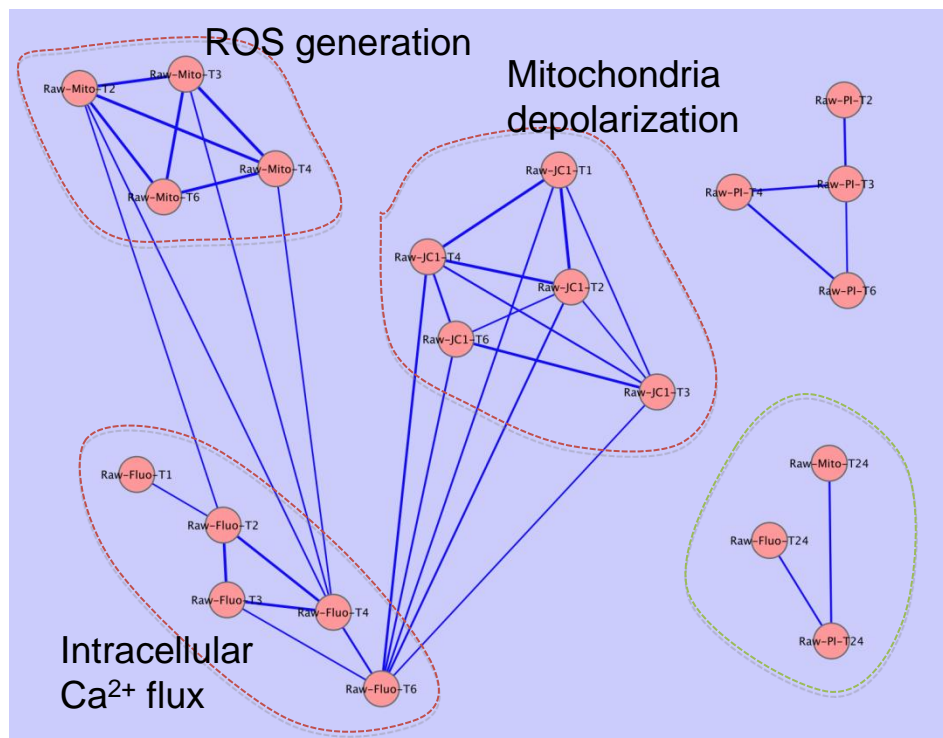


# SOM defined by clustering of the biological response characteristics



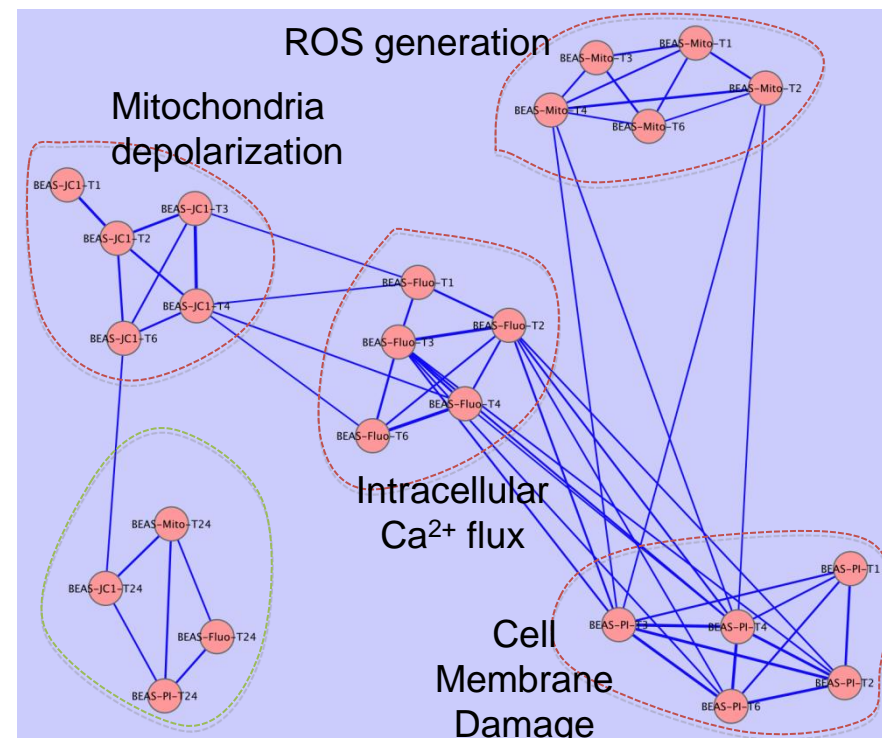
# Activity-Activity Relationships

## RAW 264.7 cells



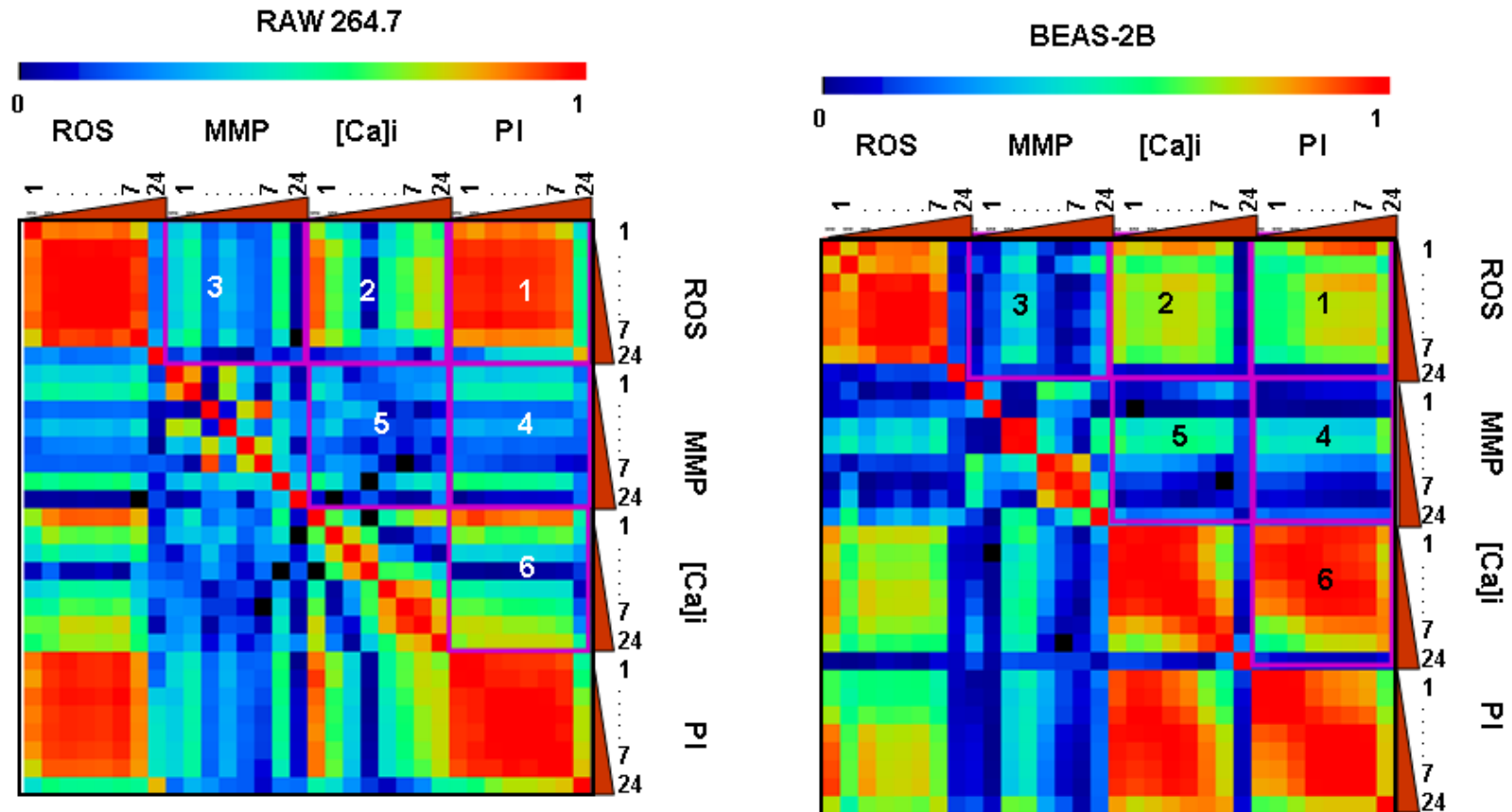
Correlation threshold:  $|r|=0.5$

## BEAS-2B cells



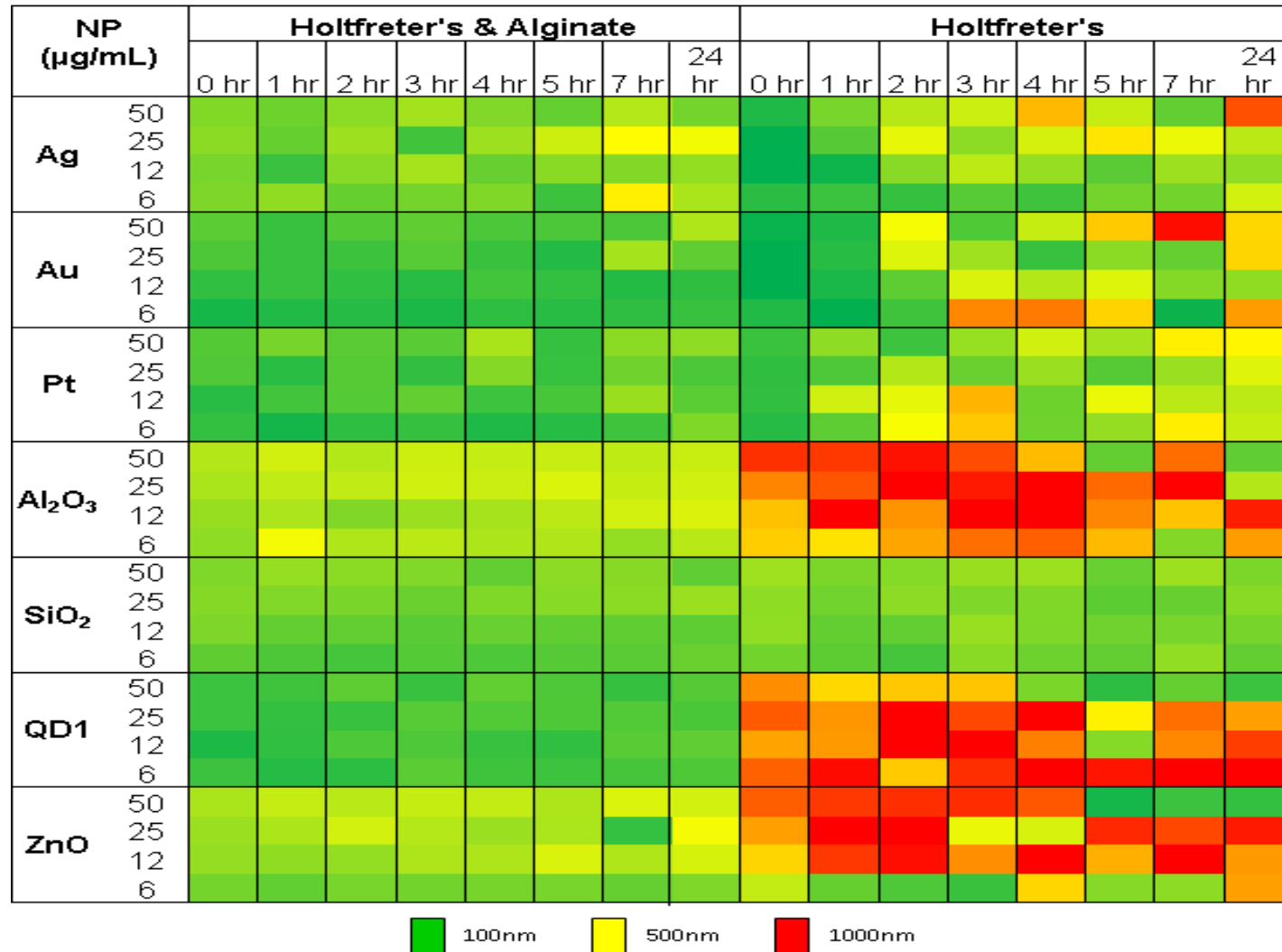
Effects after long exposure time: 24h

## Heat map display showing cellular correlation matrixes for each cytotoxicity parameter

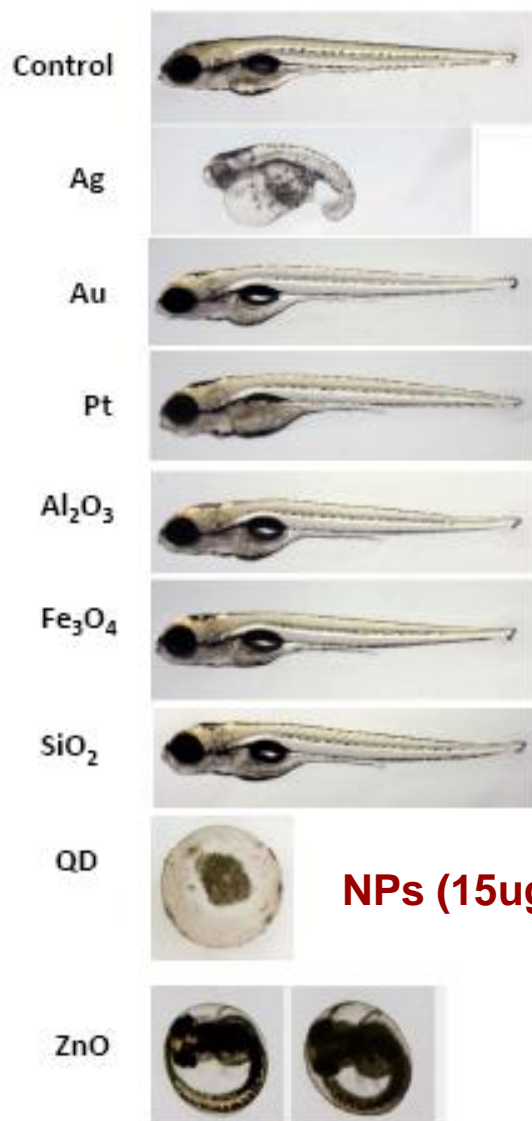


Pearson correlation for each cytotoxicity parameter was calculated from the robust z-score value.

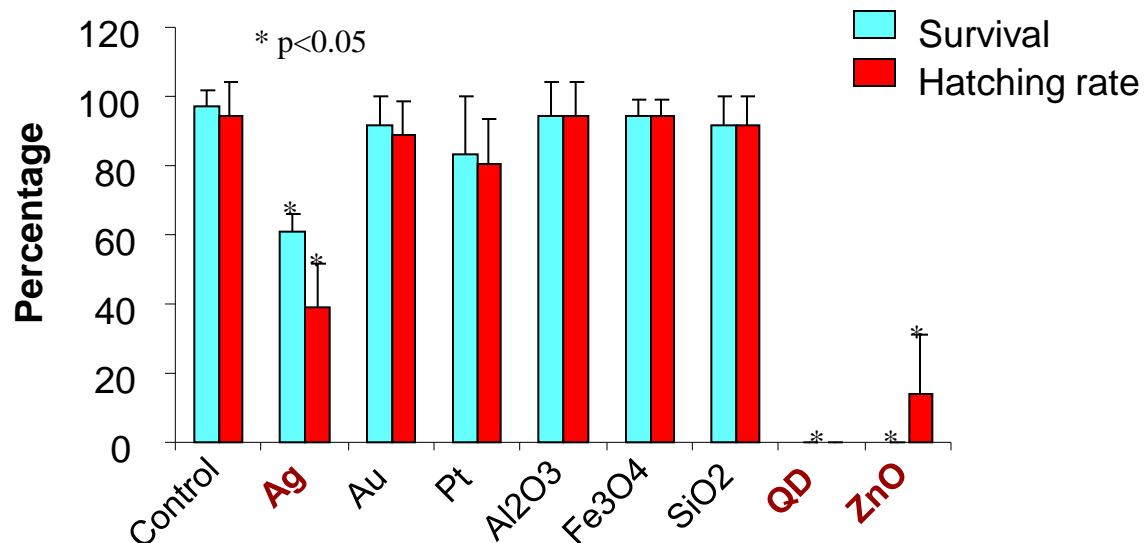
# High Throughput DLS of the Kinetics of NP agglomeration in Holtfreter's medium



## Correlation of HTS results to toxicity screening in in zebra fish



**NPs (15ug/mL)**

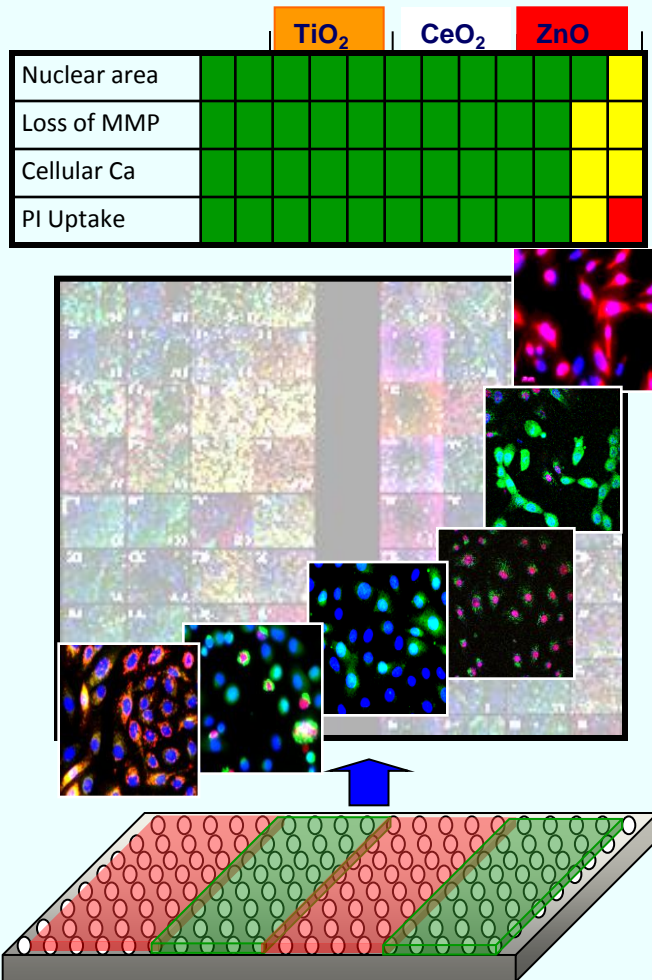


Ranking	NPs	Morphological defects	Physiological defects
0. No morphological or physiological defects	Au, $\text{Al}_2\text{O}_3$ , $\text{Fe}_3\text{O}_4$ , $\text{SiO}_2$		
1. Single morphological or physiological defect	-	-	-
2. Multiple morphological and physiological defects	Pt		Low heart beat
3. Severe multiple morphological and physiological defects	Ag		High mortality and reduced hatching rate and low heart beat
4. Embryo do not survive	ZnO, QD		Embryos do not survive or fail to hatch



# Use of a Predictive Scientific Approach towards Safe design of ZnO

## High throughput toxicity screening

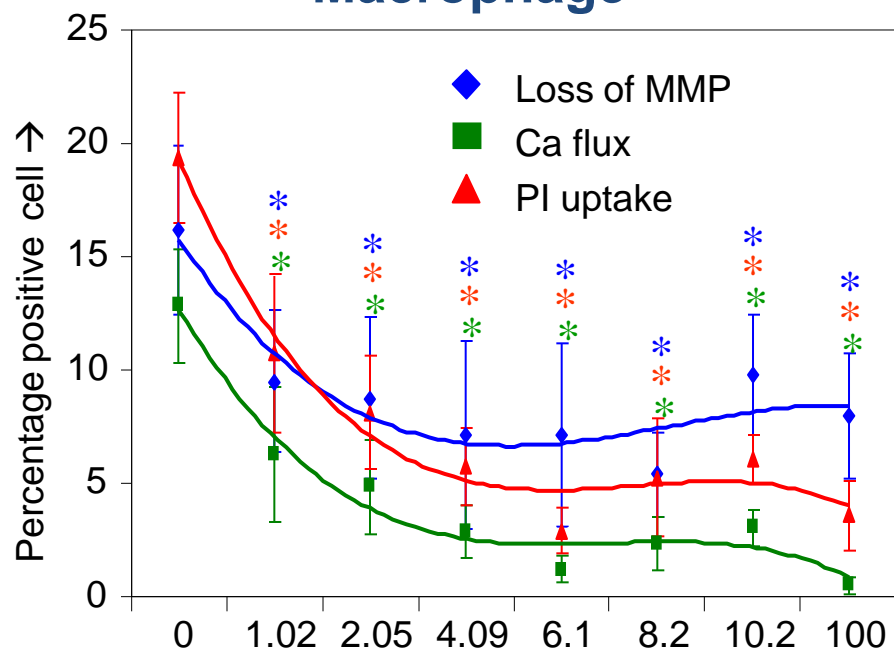


## Mechanism of ZnO nanoparticle toxicity

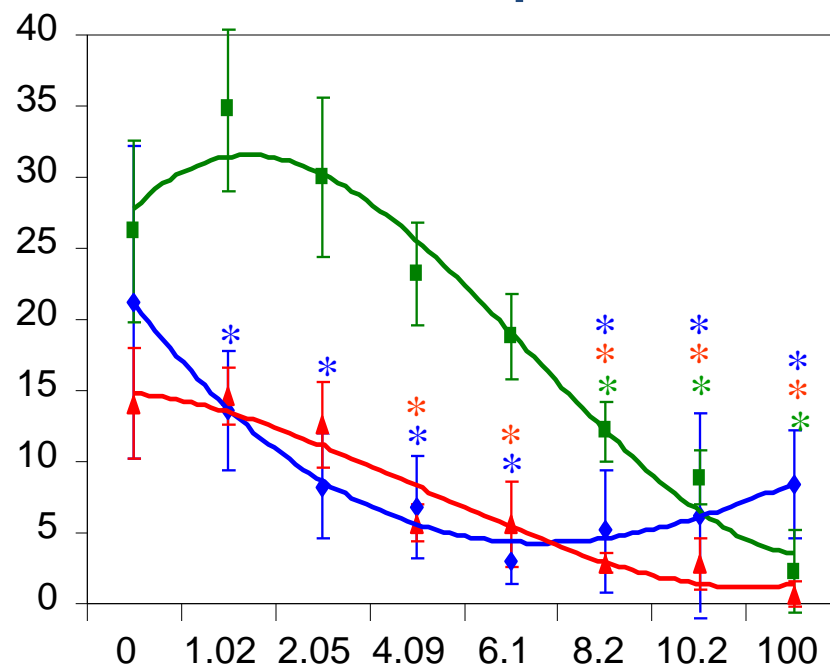


# Doped ZnO Nanoparticles are less toxic in HTS analysis

## Macrophage



## Bronchial epithelial

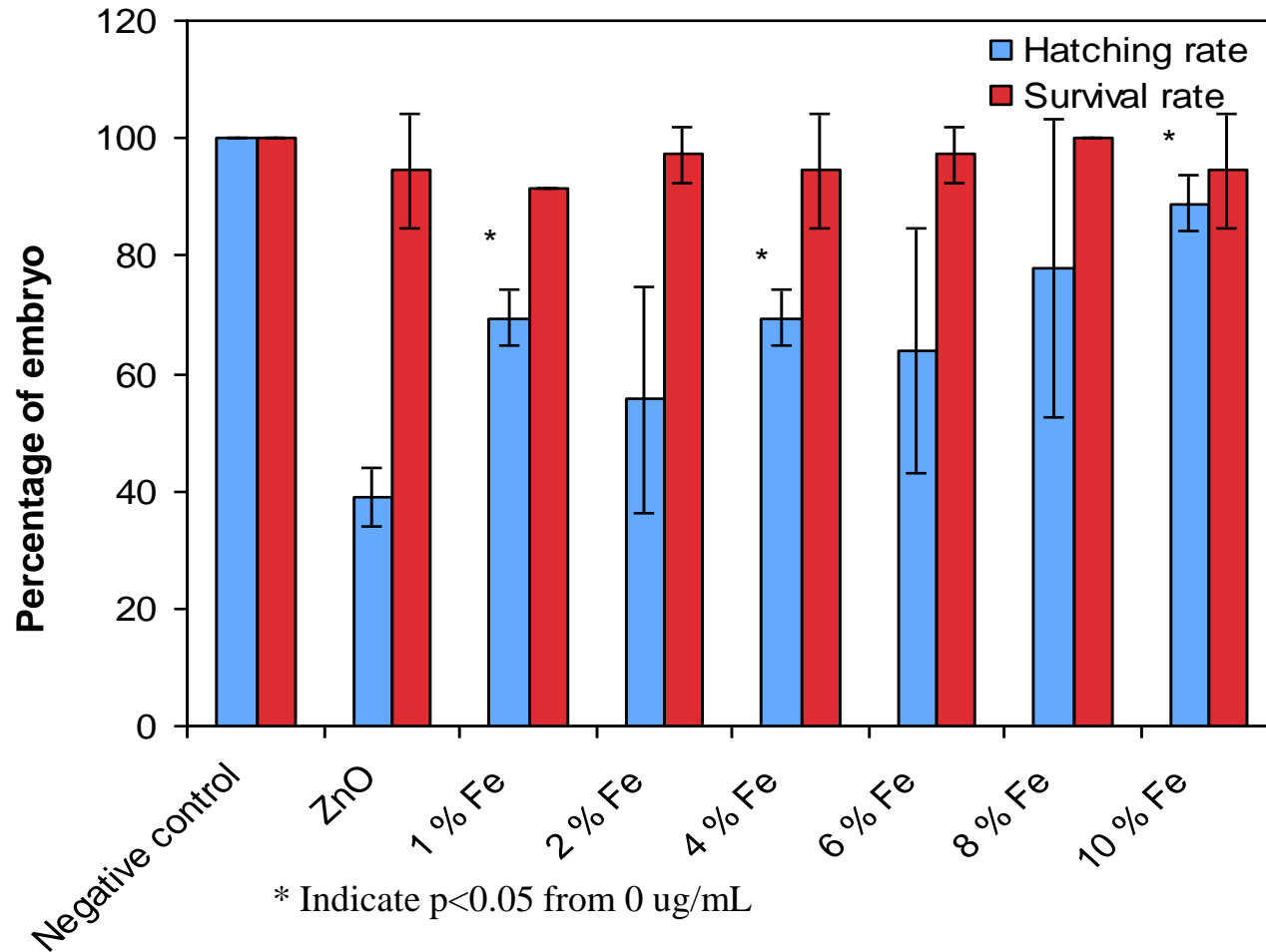


1%

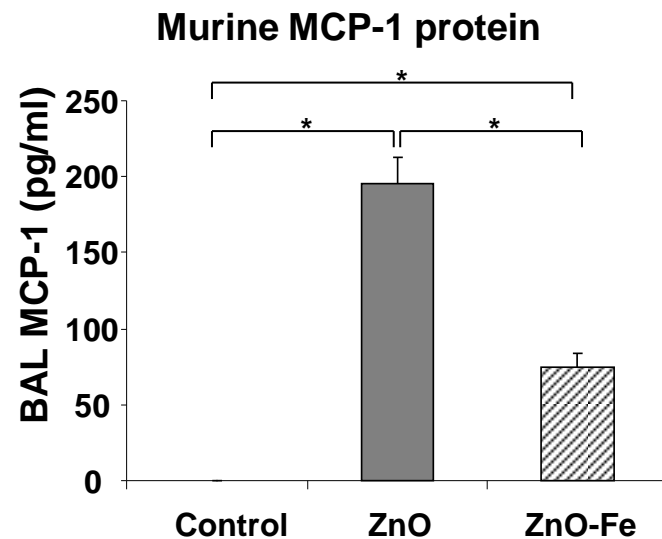
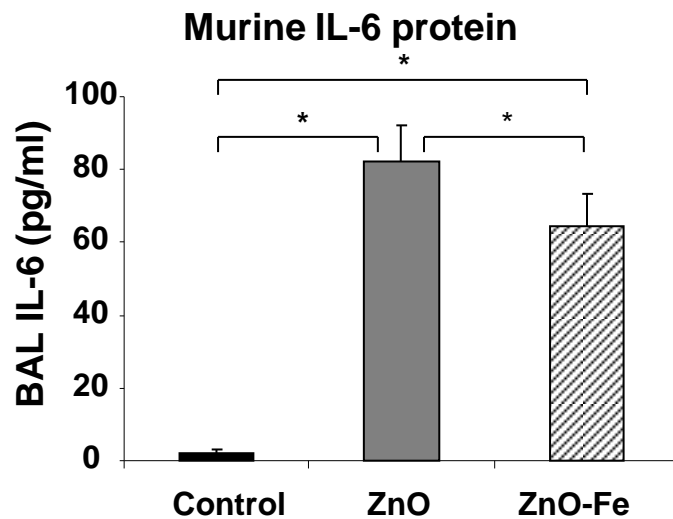
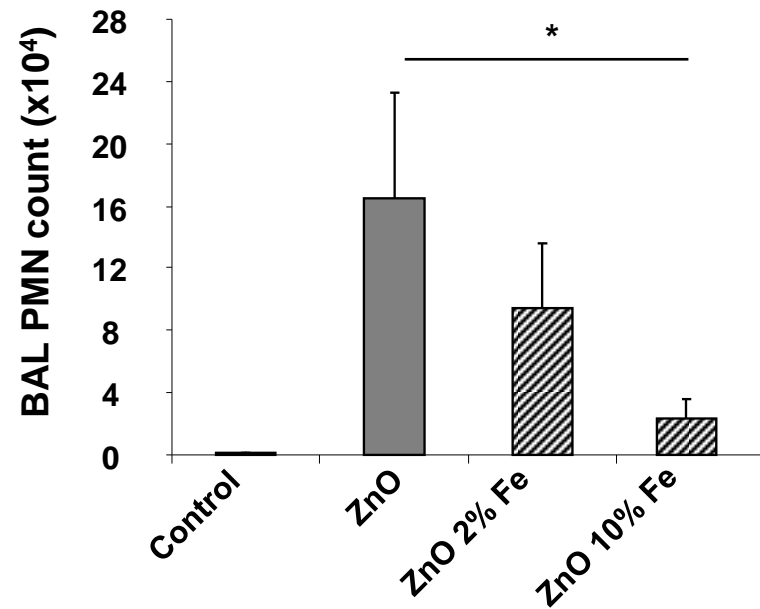
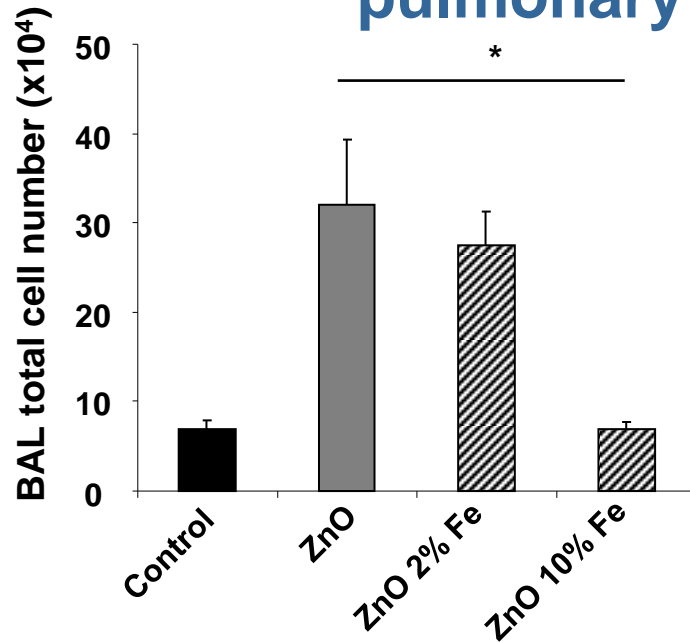
%  $\text{Fe}_3\text{O}_4$  doping

10%

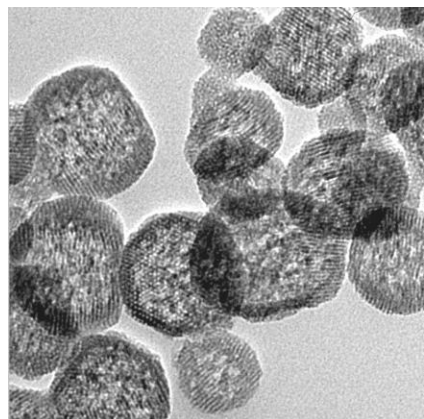
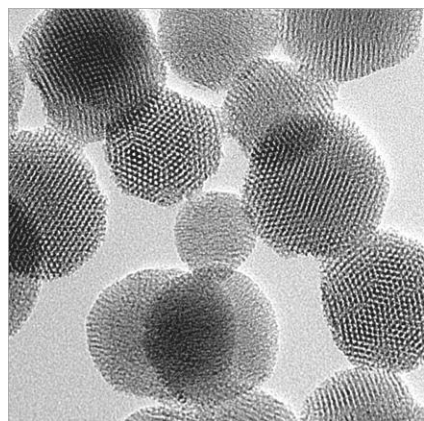
# Doped ZnO Nanoparticles are less toxic in Zebrafish Embryo Hatching Experiments



# Doped ZnO Nanoparticles are less toxic in pulmonary toxicity in mice



# Construction of a cationic MSNP library by coating with PEI



(PEI)

0.6 kD  
0.8 kD  
1.2 kD  
1.8 kD  
10 kD  
25 kD

MSNP-PEI 25 kD

MSNP-PEI 10 kD

MSNP-PEI 1.8 kD

MSNP-PEI 1.2 kD

MSNP-PEI 0.8 kD

MSNP-PEI 0.6 kD

MSNP

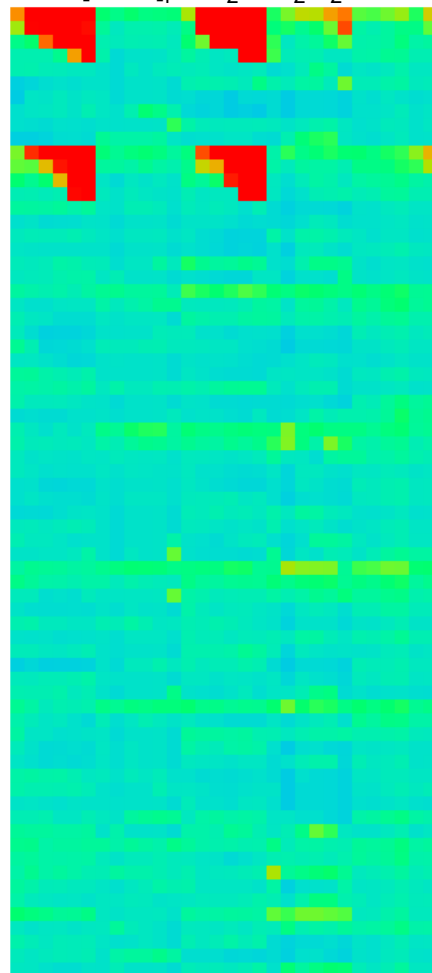
Cancer cell lines  
NHBE



PI  $[Ca^{++}]_i$   $O_2^{\cdot -}$   $H_2O_2$  MMP

200  $\mu$ g/mL

0.2  $\mu$ g/mL



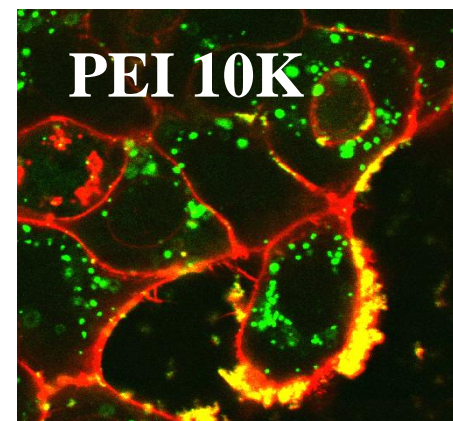
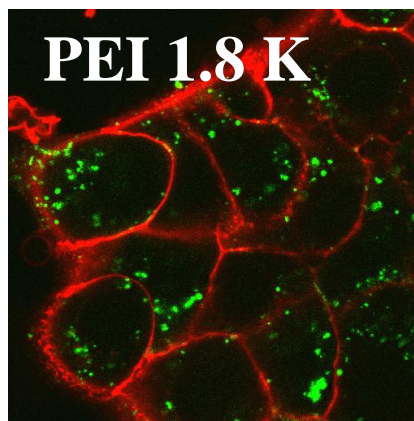
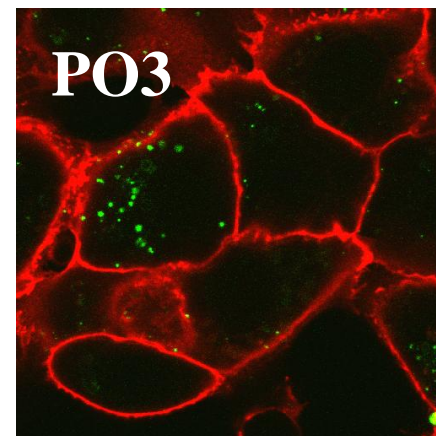
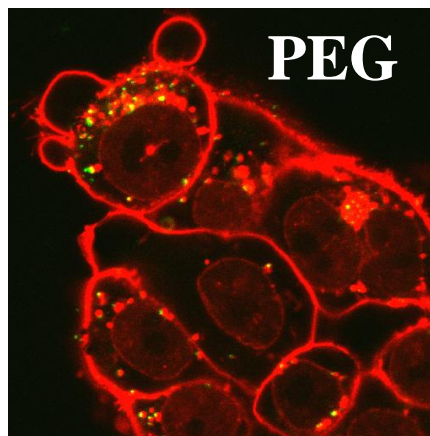
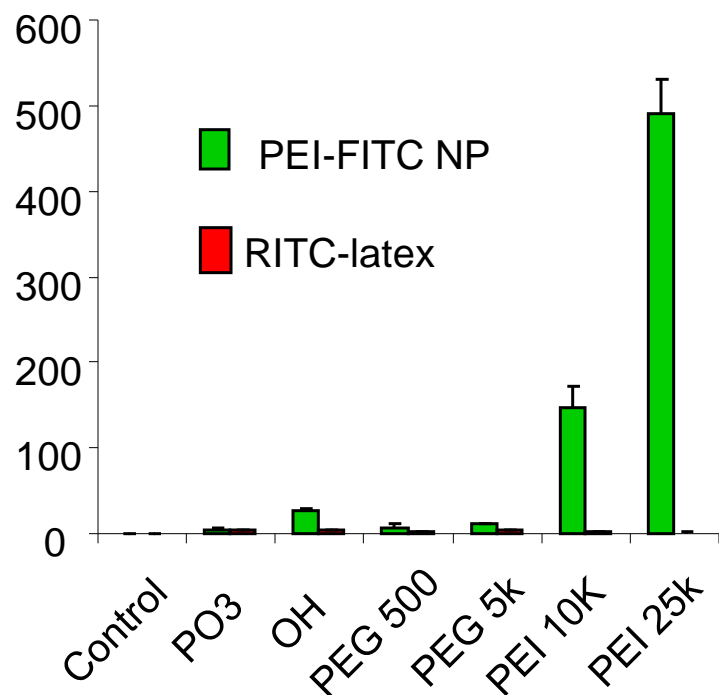
1h 6h



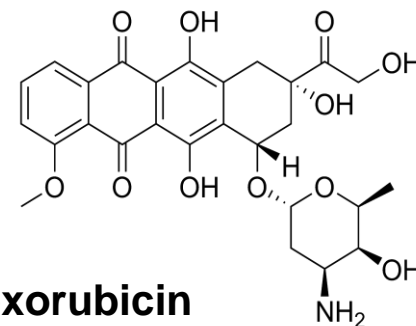
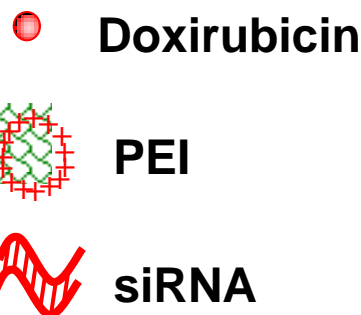
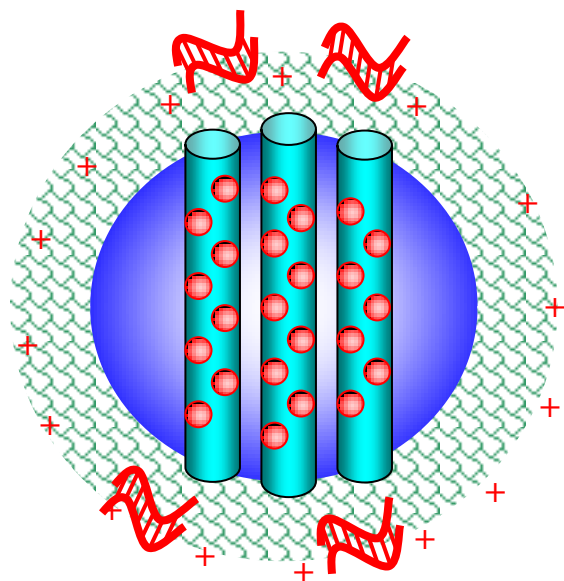
## Reduced polymer length, low toxicity MSNPs have high uptake in cancer cells

PANC-1 cells

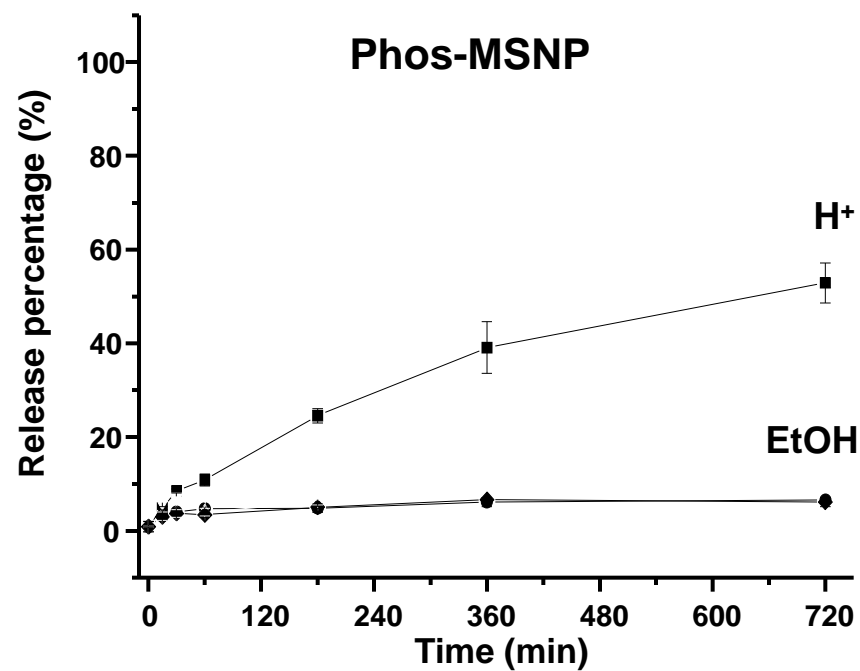
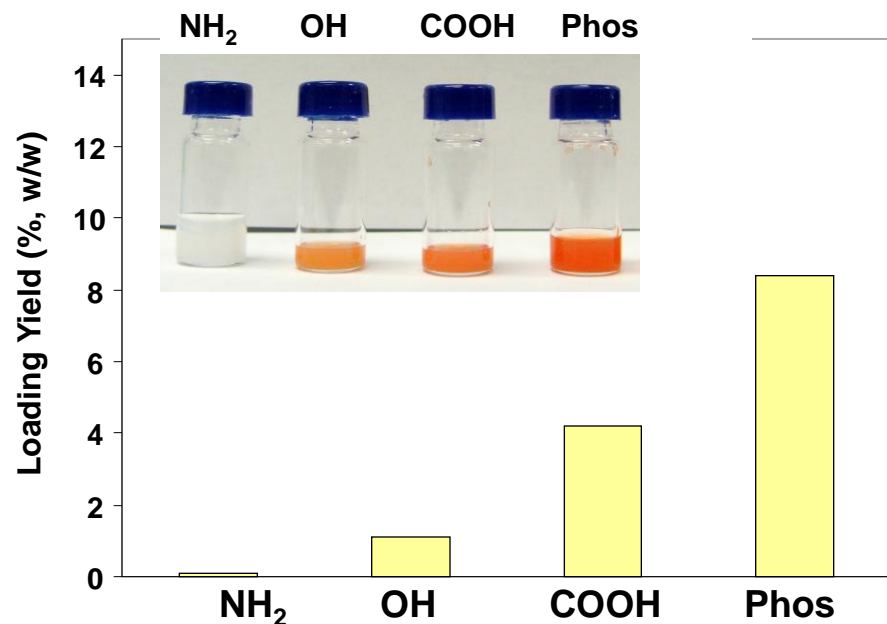
Fold  $\uparrow$  cell fluorescence



# Reduced polymer length MSNPs allow siRNA Attachment but keep the pores available for doxorubicin loading

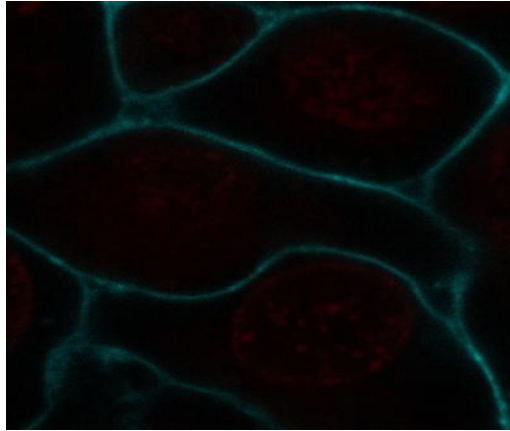


Huan Meng et al. ACS Nano. 2010

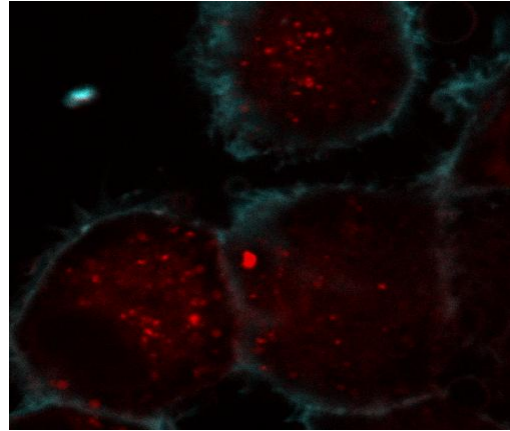


# Co-delivery of Pgp siRNA with Dox can Overcome Dox resistance in a Squamous carcinoma cell line

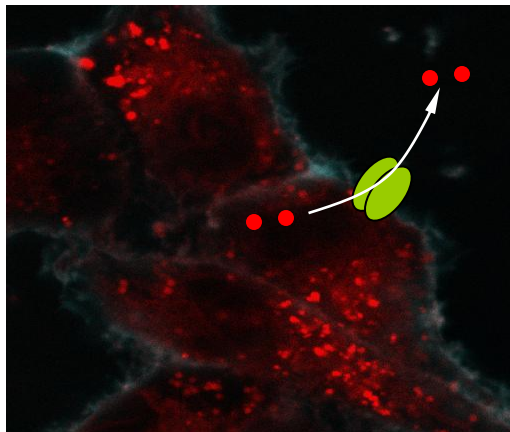
Free Dox



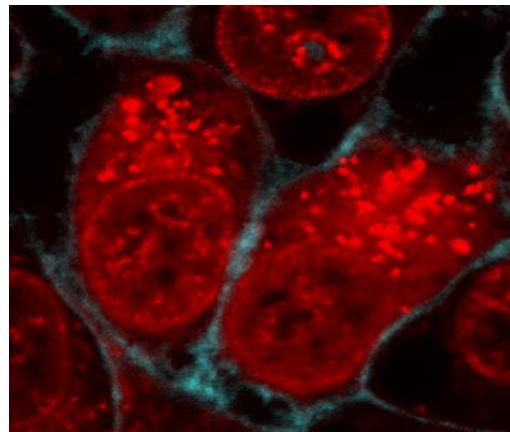
Dox-MSN



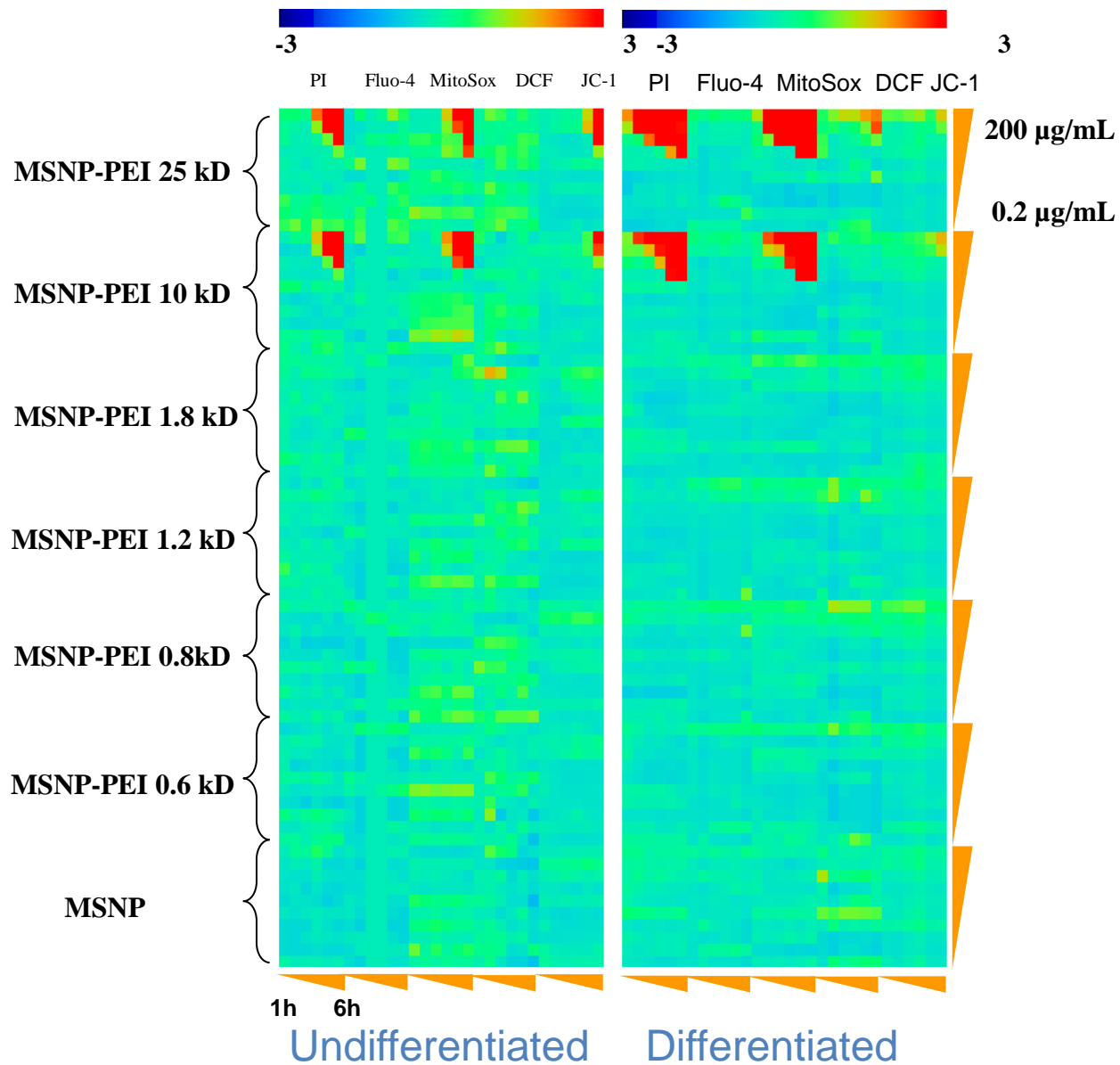
PEI-Dox-MSN



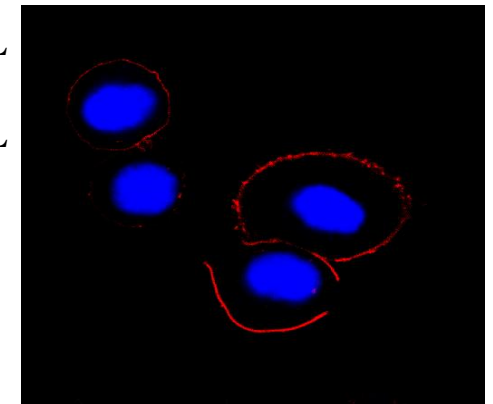
siRNA-PEI-Dox-MSN



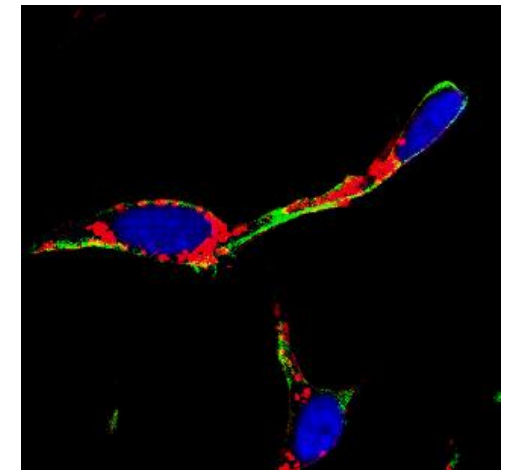
# Differential toxicity of cationic NP depending on cellular differentiation



Undifferentiated



Differentiated



# **Acknowledgements**

## **Nel Laboratory:**

**Andre Nel**

**Tian Xia**

**Saji George**

**Huan Meng**

**Xiang Wang**

**Ning Li**

**Meiying Wang**

**Ning Li**

## **Collaborators:**

**Lutz Maedler**

**Suman Pohkrel**

**Jeff Zink**

**Ivy Ji**

**Ken Bradley**

**Robert Damoiseaux**

**Yoram Cohen**

**Robert Rallo**

**Grant support: NSF- and EPA-funded CEIN  
NIEHS-funded U19 and RC2**